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# Unwinding the layers of high hyperdiploid childhood acute lymphoblastic leukemia 

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Unwinding the layers of high hyperdiploid childhood acute lymphoblastic leukemia

# Unwinding the layers of high hyperdiploid childhood acute lymphoblastic leukemia 

Larissa H. Moura-Castro



## DOCTORAL DISSERTATION

Doctoral dissertation for the degree of Doctor of Philosophy (PhD) at the Faculty of Medicine at Lund University to be publicly defended on $18^{\text {th }}$ of April 2024 at 09.00 at Belfragesalen, BMC D15, Lund

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#### Abstract

:

High hyperdiploid $(\mathrm{HeH})$ acute lymphoblastic leukemia (ALL) is one of the most common pediatric cancer types. It is more frequent in children between 2-4 years old and usually has a favorable prognosis. The modal number in the leukemic cells from this subtype ranges from 51 to 67 chromosomes, marked by non-random chromosome gains. In this thesis, I investigated the leukemogenesis of HeH ALL, focusing on the origins and effects of aneuploidy (whole chromosome gains), as well as genome organization and transcription regulation.

In Article I we found that HeH ALL primary samples, compared to ETV6::RUNX1 ALL, harbor genomewide transcription dysregulation associated with the chromosome gains. We further found that HeH cases display low levels of CTCF and the cohesin complex, as well as aberrant interphase and metaphase chromatin architecture. In Article II, we showed that the HeH ALL subtype displays recurrent sister chromatid cohesion defects. We further observed low gene expression of cohesin subunit RAD21 and condensin subunit NCAPG, as well as chromosome copy number variation associated with cohesion defects. In Article III, we investigated the 3D chromatin landscape of nine genetic subtypes of B-cell precursor ALL, identifying different clusters based on their chromatin signature, and revealing major chromosome disorganization in aneuploid samples affecting gene regulation, including the leukemiarelated genes FLT3 and IKZF1. In Article IV, we studied clonal evolution in primary HeH ALL samples at the single-cell level, revealing that this subtype displays stable aneuploid cells with little chromosome number variation. Our results from in silico modeling and analysis of 577 HeH samples suggest that HeH cells originate from a punctuated event caused by a diploid cell undergoing tripolar division.

Ultimately, this thesis contributes to our understanding of the origins and development of HeH ALL. I characterize its chromosome architecture at the interphase and metaphase level and show how these features associate with topological gene regulation.


Key words: acute lymphoblastic leukemia, high hyperdiploidy, chromatin organization, transcriptional regulation, CTCF, cohesin, clonal heterogeneity

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To my family.

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## Original Papers

## Article I

Yang M, Vesterlund M, Siavelis I, Moura-Castro LH, Castor A, Fioretos T, Jafari R, Lilljebjörn H, Odom DT, Olsson L, Ravi N, Woodward EL, Harewood L, Lehtiö J and Paulsson K. Proteogenomics and hi-C reveal transcriptional dysregulation in high hyperdiploid childhood acute lymphoblastic leukemia. Nat Commun. 2019;10(1):1519.

## Article II

Moura-Castro LH, Peña-Martínez P, Castor A, Galeev R, Larsson J, Järås M, Yang M and Paulsson K. Sister chromatid cohesion defects are associated with chromosomal copy number heterogeneity in high hyperdiploid childhood acute lymphoblastic leukemia. Genes Chromosomes Cancer. 2021;60:410-417.

## Article III

Moura-Castro LH, Yang M, Dushime GT, Woodward EL, Aydin E, Castor A, Olsson-Arvidsson L, Fioretos T, Johansson B, Järås M, Hagström-Andersson AK and Paulsson K. The 3D genome of pediatric B-cell precursor acute lymphoblastic leukemia. Manuscript.

## Article IV

Woodward EL, Yang M, Moura-Castro LH, van den Bos H, Gunnarsson R, OlssonArvidsson L, Spierings DCJ, Castor A, Duployez N, Zaliova M, Zuna J, Johansson B, Foijer F and Paulsson K. Clonal origin and development of high hyperdiploidy in childhood acute lymphoblastic leukaemia. Nat Commиn. 2023;14:1658.

## Abbreviations

| 3C | Chromatin conformation capture |
| :--- | :--- |
| ALL | Acute lymphoblastic leukemia |
| AML | Acute myeloid leukemia |
| APC/C | Anaphase promoting complex or cyclosome |
| ATAC-seq | Assay for transposase accessible chromatin sequencing |
| B/ATRI | Before/After trisomy |
| BCP | B-cell precursor |
| BSA | Bovine serum albumin |
| BTRI | Before trisomy |
| cDNA | Copy DNA |
| CDKs | Cyclin-dependent kinases |
| CIN | Chromosomal instability |
| CLL | Chronic lymphocytic leukemia |
| CLP | Common lymphoid progenitor |
| CML | Chronic myeloid leukemia |
| CMP | Common myeloid progenitor |
| CMS | Chromosome morphology score |
| CNA | Copy number alteration |
| C-NHEJ | Canonical non-homologous end-joining |
| CNS | Central nervous system |
| DC | Dendritic cell |
| der() | Derivative chromosome |
| DGE | Differential gene expression |
| DSB | Double-strand break |
| E-P | Enhancer - promoter |
| FACS | Fluorescence-activating cell sorting |
| FISH | Fluorescence in situ hybridization |
| GMP | Granulocyte/macrophage progenitor |
| GWAS | Genome-wide association study |
| HeH | High hyperdiploid |
| HSC | Hematopoietic stem cell |
| iAMP21 | Intrachromosomal amplification of chromosome 21 |
| ISH | In situ hybridization |
| LMPP | Lymphoid-primed multipotent progenitor |
| MEP | Megakaryocyte/erythrocyte progenitor |
|  |  |


| mDC | Myeloid dendritic cells |
| :--- | :--- |
| MNC | Modal number of chromosomes |
| mRNA | Messenger RNA |
| MS | Mass spectrometry |
| MS/MS | Tandem mass spectrometry |
| MTX | Methotrexate |
| NEB | Nuclear envelope breakdown |
| NGS | Next-generation sequencing |
| NK | Natural killer |
| NuMA | Nuclear mitotic apparatus |
| PCA | Principal component analysis |
| PCR | Polymerase chain reaction |
| PCG | Primary constriction gap |
| pDC | Plasmacytoid dendritic cells |
| Pol II | RNA polymerase II |
| P-P | Promoter - promoter |
| qPCR | Quantitative polymerase chain reaction |
| RAD21-KD | RAD2l knockdown |
| RNAi | RNA interference |
| RNA-seq | RNA sequencing |
| SAC | Spindle assembly checkpoint |
| scWGS | Single-cell whole genome sequencing |
| SMC | Structural maintenance of chromosome |
| SNP | Single nucleotide polymorphism |
| SNV | Single nucleotide variant |
| SV | Structural variant |
| TAD | Topologically associating domain |
| t() | Translocation |
| UPID | Uniparental isodisomy |
| WCP | Whole-chromosome paint |
| WES | Whole exome sequencing |
| WGBS | Whole genome bisulfite sequencing |
| WGS | Whole genome sequencing |
| wUPID | Whole chromosome uniparental isodisomy |
|  |  |

## Overview

Unwinding the layers of high hyperdiploid childhood acute lymphoblastic leukemia seeks to explore the molecular pathogenesis of this subtype and increase our knowledge of its characteristics, development, and origin. In order to understand the biological meaning behind many genetic features discussed in this thesis, the introduction will cover the basis of several mechanisms and fundaments that are relevant to our research.

Firstly, the processes of cell division, chromosome formation, genome organization and cancer genetics are briefly presented. The second part of the introduction focuses on formation of blood cells, leukemogenesis and, finally, the clinical and genetic aspects of B-cell precursor childhood acute lymphoblastic leukemia (ALL), with emphasis on the high hyperdiploid $(\mathrm{HeH})$ subtype. The specific aims of this thesis are then presented, and I discuss the methods that have been performed, followed by a description of the main results of each included article. The four articles are discussed together and divided into two main themes: What drives leukemogenesis in HeH ALL? and Stable or unstable? Origins and clonal evolution of $\mathbf{H e H} \boldsymbol{A L L}$, where I put our findings in the context of the present literature, closing the thesis summary with concluding remarks.

## Introduction - Part I

## The cell cycle

## Cell division and the first stages of cell cycle

The concept of cell division was first proposed in the 1850s by the embryologist Robert Remak while he studied frog embryos, describing the cell creation as a continuous division starting at the nucleus. Still, it took 3 more decades to understand mitosis, when Walther Flemming in 1882 described that the longitudinal half of each chromosome went to each daughter cell (1). After over 150 years of research from the cell theory to cell cycle division, we now have a profound knowledge of the stages a cell undergoes to generate daughter cells (2).

A cell in a state of quiescence is in the G0 phase. From the moment it starts the cell division cycle, it enters the interphase, which comprises G1, S and G2. Hereafter the cell enters the M phase, including firstly mitosis, which is subdivided into prophase, prometaphase, metaphase, anaphase and telophase, and secondly cytokinesis, when the cytoplasm of the cell divides to form two daughter cells. Mediation of cell cycle is ensured by regulatory cyclin subunits and cyclindependent kinases (CDKs), including CDK1 (G2 and M), CDK2 (G1 and S) and CDK4/6 (G1), and its progression is tightly controlled by checkpoints that secure engagement of essential steps before moving from one phase to the next one. The main checkpoints are the G1/S restriction checkpoint, the G2/M DNA damage checkpoint, and the spindle assembly checkpoint (SAC) (2).

The G1 is a growth phase, where the cells synthesize a large number of proteins, and by reaching a certain size the cell decides whether to enter $S$ phase by CDK activation, differentiate or undergo cell death. Next, the cell enters the DNA synthesis, or S phase, when DNA replication occurs and doubles the content of each chromosome into two sister chromatids. The G2 phase follows DNA synthesis, and is marked by several preparations for mitosis, most remarkably DNA double-strand breaks repair, which is essential to pass the G2/M checkpoint. Lastly, the nucleus of
the cell divides during mitosis, and the cytoplasm divides to form the daughter cells (2).

## Prophase, prometaphase and mitotic spindle pole formation

Mitotic progression starts in prophase when topoisomerase II and the condensin complex initiate chromatin condensation and begin to shape the very recognizable individual mitotic chromosomes. Another important event is the separation of centrosomes and subsequent migration to the opposite poles to form the bipolar mitotic spindle apparatus. In late prophase, the cell becomes committed to mitosis, i.e. the process is no longer reversible, as the nuclear envelope breakdown (NEB) occurs. At this point, centrosomes are already generating dynamic microtubule arrays, that after NEB can reach for the chromosomes (2-4).

During prometaphase, chromosomes are fully condensed, and each sister chromatid must attach to opposing microtubules to form the spindle poles. Specifically, it is the disk-shape proteins located in the centromeric region of each chromosome, known as kinetochores, that interact with the microtubules (2-4).

## Metaphase, SAC and transition to anaphase

The mitotic chromosomes, now captured by microtubules, are moved towards the cell equator, and aligned in the so-called metaphase plate, as the cell prepares for the SAC. Here, if a single chromosome is not attached to microtubules, anaphase onset is delayed. This delay is ensured by the production of inhibitory complexes, catalyzed by unattached kinetochores, that blocks the destruction of securin and cyclin B regulatory subunit CDK1, preventing sister chromatid separation and mitotic exit. Meanwhile, aurora-B kinase plays the main role in correcting errors in spindle pole attachment (3).

One of the key events in metaphase to anaphase transition is activation of the anaphase promoting complex or cyclosome (APC/C) by forming a protein complex with CDC20. Early anaphase then initiates as APC/C-CDC20 degrades securin in chromosome centromeres, enabling separase to cleave cohesin and allowing sister chromatid segregation towards opposing poles. Simultaneously, the same protein complex degrades cyclin B1, terminating CDK1 activity and enabling mitotic exit. PP1 $\gamma$ dephosphorylates histone H3 bound to chromatin, which will allow later chromosome decompaction. Among other biochemical and mechanical changes,
aurora B kinase is dephosphorylated and moves from the chromatin to the center of the spindle pole (4).

## Late anaphase, telophase and cytokinesis

As microtubules have been continuously shortening, in late anaphase the spindle poles finally move apart. The phosphorylation gradient caused by aurora B kinase localizing in the equator of the spindle pole is essential to keep the two forming chromatin masses from invading the center zone, reinforcing the division that is being created. The nuclear mitotic apparatus (NuMA), which had been removed from chromatin, is phosphorylated, and allowed to return to its position for further chromatin decondensation. A new nuclear envelope begins to be formed in each side, together with nuclear pore complexes, and start separating the nuclear DNA from the cytoplasm $(\mathbf{2}, 4)$.

Entering telophase, spastin promotes microtubule disassembly from the chromatin while ESCRT closes the gaps in the nuclear envelope. Actin cytoskeleton forms an actomyosin-ring in the midbody of the dividing cell. Furrow ingression via cytokinesis then takes part by contraction of the actomyosin-ring, separating the cytoplasm of the two emerging daughter cells. Lastly, cytoskeleton structures are removed from the intercellular bridge, and further contraction of the cell cortex seals the plasma membrane, releasing the two daughter cells $(2,4)$.

## The cohesin complex

Cohesin is a ring-like, multiprotein complex, also known as a structural maintenance of chromosome (SMC) protein complex (5, 6) (Figure 1). In somatic cells, the complex is composed of two SMC heterodimer proteins, $\mathrm{SMC1} / 3$, the kleisin subunit RAD21 and either a STAG1 or STAG2 subunit, while different versions of these proteins - except SMC3 - occur in meiosis-related cohesins (5, 7). Cohesin entraps chromatin in a topological manner, without direct binding, making the integrity of the ring essential for its proper function (7). Association of cohesin to DNA starts in the G1 phase of the cell cycle, and requires the loading factors NIPBL and MAU2, a process antagonized by the releasing complex, WAPL and PDS5A/B $(7,8)$.

Cohesin first known function was to embrace sister chromatids and maintain cohesion from DNA replication to cell division and thus assist proper chromosome segregation (5, 8). In G1, cohesin associates with single DNA strands, entrapping
both sister chromatids after the DNA replication fork passes. Cohesion is then maintained by acetylation of SMC3 and recruitment of Sororin to PDS5, which displaces WAPL and prevents the ring complex from unloading $(\mathbf{7 , 8})$. Here, cohesin facilitates double-stranded DNA repair by homologous recombination and assists the replication fork to restart if it stalls. When cells enter mitosis, most cohesins are unloaded by activation of CDK1, Aurora kinase B and PLK1, which phosphorylate Sororin and STAG1/2 along the chromosomes and allow hyperactivity of the releasing complex. In the centromeric regions, however, Shugoshin 1 and protein phosphatase 2A (PP2A) protect Sororin from phosphorylation and cohesion is maintained, allowing chromosome alignment in the metaphase plate and ensuring correct orientation of sister kinetochores. At the beginning of anaphase, the APC/C cleaves Securin, releasing Separase to dissolve the remaining cohesins and promoting separation of the sister chromatids (7-9).

## Formation of mitotic chromosomes

At the onset of mitotic progression, interphase chromatin must be highly compacted and individualized into cylindrical chromosomes to ensure the integrity of the replicated genome into each daughter cell. Mitotic chromosomes are formed by consecutive DNA loops, anchored by an axis and organized in radial arrays (10). It is believed that the condensin complexes are responsible for the topological organization of mitotic chromosomes via loop extrusion, that result in the shortening of the chromatin $(\mathbf{1 0}, \mathbf{1 1})$.

Condensins I and II, similarly to cohesin, are also ring-shaped SMC protein complexes, composed of SMC2, SMC4, the CAPH/H2 kleisin and the subunits CAPD2/D3 and CAPG/G2 (6, 12) (Figure 1). Condensin II is responsible for the first layer of chromatin loops during prophase, followed by condensin I loop nesting for further condensation after NEB. By prometaphase, the mitotic chromosome loop formation has acquired a helical shape, being the base for the chromosome bodies. Another vital function of condensin is to provide rigidity for mitotic chromosomes to resist the pulling forces suffered when microtubules attach to the kinetochores (10).

Although essential for mitotic chromosome organization, condensin is not the main player in global compaction of mitotic chromatin. Chromatin fiber compaction is mostly regulated by histones that suffers mitosis-specific post-translational modifications (10). In particular, de-acetylation of $\mathrm{H} 2 \mathrm{~B}, \mathrm{H} 3$ and H 4 during mitosis
is very prominent, suggesting that electrostatic interactions of histone tails trigger chromatin compaction (13).

Resolution of sister chromatids begin soon after DNA replication, and in G2 the replicated genome is already separated. Condensin, cohesin and topoisomerase II have been suggested to take part in chromosome resolution, although the full mechanism behind this process remains uncertain (10). Recently, it was found that Ki-67, a protein located in the mitotic chromosome periphery, prevents mitotic chromosomes from crumpling into a single body after nuclear envelope disassembly. During late prophase, Ki-67 assembles a layer of proteins and RNAs in the surroundings of mitotic chromosomes and forms a brush-like steric and electrostatic barrier. The charge barrier disperses particles on the surface of mitotic chromosomes, promoting their individualization $(\mathbf{1 0}, \mathbf{1 4})$.

In early anaphase, the DNA cross-bridging protein BAF is dephosphorylated and binds to chromatin, forming a stiff cross-bridged chromatin layer around each set of anaphase chromosomes. The BAF-induced chromatin network enables the assembly of new nuclear envelopes during mitotic exit (10, 15).

## Chromatin folding and organization

## Hierarchy of chromatin folding

Over 100 years ago Carl Rabl, and then Theodor Boveri, proposed that chromosomes occupy distinct territories during interphase (11). Later in 1974, a chromatin structure of 8 histone molecules wrapping around 200 base pairs (bp) of DNA was described by Roger Kornberg and named as nucleosome - the smallest folding unit in chromatin organization (11, 16). From the largest to the smallest, we now understand much of how chromatin is structured thanks to the constant emergence of technologies to study genome folding.

The process of chromatin folding is hierarchical and highly conserved in eukaryotes (Figure 2). Below the distinct chromosome territories, there are sub-chromosomal compartments separating transcriptionally active and inactive genomic regions, known as A and B compartments respectively $(\mathbf{1 7 , 1 8 ) . ~ F u r t h e r m o r e , ~ a r e a s ~ o f ~ t h e ~}$ same chromatin state, A or B, show a preference for interacting with each other, not only within the same chromosome but genome-wide (18). At the submegabasescale, stretches of 1 to 5 genes are contained in topologically associating domains
(TADs), which favor internal interactions while insulating communication between different TADs (19-21).


Figure $1 \mid$ The cohesin and condensin complexes. Both the cohesin and the condensin complexes have a ring-like shape and consist of two SMC subunits, a kleisin subunit and associating HEAT repeat subunits. During mitosis, condensin II binds to DNA and form loops to fold the chromatin, while condensin I further compacts the chromatin by pumping inner loops. Similarly, cohesin binds to CTCF during interphase and pumps DNA inwards to form loops that will become topologically associating domains (TADs). Created using Biorender.


Figure 2 | Hierarchy of chromatin folding. The first level of chromatin compaction is the chromatin fiber, formed by nucleosomes that wind approximately 200 bp of DNA. Cohesin binds to CTCF in specific binding sites and forms TADs by loop extrusion, insulating 1-5 genes per domain. Chromatin with the same transcriptional activity level clusters together, forming A (more active) and B (less active) compartments. Finally, each chromosome during interphase occupies a specific area of the nucleus, known as chromosome territory. Created using Biorender.

Entering the fine-scale area of organization, we encounter chromatin loops. In 2015 it was shown that $99 \%$ of loops were anchored by the insulator protein CTCF, and $80 \%$ co-localized with cohesin complex binding sites (11, 22). In this same level, there are also cis-regulatory elements controlling gene expression in long-range interactions, known as enhancer-promoter (E-P) and promoter-promoter (P-P) links, usually 5-200 kb long (23-25). Transcription co-activators such as Mediator and YY1 and chromatin remodelers like BRG1 mediate E-P links together with the
transcription machinery of RNA Polymerase II (Pol II). Interestingly, a recent study showed that E-P and P-P links nest stretches of chromatin, and form loops with a different set of boundary markers, including transcription factors and histones (25). E-P and P-P loops are formed without CTCF and cohesin binding sites, and acute depletion of such proteins have little effect on this type of loop formation (26). This knowledge together with the fact that gene expression has a better correlation to EP and $\mathrm{P}-\mathrm{P}$ loops than to cohesin loops suggest that the cohesin complex might have a greater role in chromatin structure than in topological gene regulation (25, 26).

## CTCF, Cohesin and Condensin

CTCF is an 11-zinc-finger, sequence-specific DNA binding protein, and the only known insulator protein in vertebrates. This protein is, consequently, indispensable for genome folding, and not surprisingly enriched at transitions between different chromatin states and involved in interactions with the nuclear lamina. CTCF is sensitive to DNA methylation, implying that epigenetic changes interfere with its binding and affect gene expression. Lastly, CTCF shares a functional relationship with the cohesin complex, as mentioned before, co-occupying binding sites throughout the genome and defining anchor points of chromatin folding (5).

Cohesin plays an important role in topological organization of the genome as CTCF and cohesin share a large amount of co-occupied chromatin sites, where STAG1/2 interacts with the C-terminus of CTCF (5). Following this discovery, the loopextrusion model (Figure 1) was suggested and heavily evidenced to explain TAD formation, where the cohesin complex embraces the chromatin, pumping it inwards until blocked by two convergent CTCF proteins bound to the DNA (25, 27, 28). While cohesin is responsible for loop and TAD formation, recent data showed that condensin II and transcription factor III C (TFIIIC) co-localize at TAD boundaries that interact to form compartments, revealing a new role for this SMC complex (6).

## Cancer genetics

## The hallmarks of cancer

Hanahan and Weinberg first proposed in 2000 that tumorigenesis is a multistep process that relies in the acquirement of six biological abilities necessary to overt cancer. These included self-sufficient proliferative signaling, evading growth suppressors, tissue invasion and metastasis in solid tumors, replicative immortality,
inducing or accessing vasculature and resisting apoptosis (29). As our understanding of cancer continues to increase, the hallmarks of cancer have been through two revisions ( $\mathbf{3 0}, \mathbf{3 1}$ ), adding new distinguished characteristics of cancer cells, such as genome instability and mutation, unlocking phenotypic plasticity and disrupting differentiation. The number of accumulated mutations necessary in the process of cancer formation can be extensive, and this progressive transformation is frequently long termed (29-31).

## Defects during mitosis and mitotic slippage

Mitosis is a fundamental process that requires meticulous regulation to ensure fidelity of the genetic material that will be passed on to the daughter cells. Any abnormalities related to microtubule attachment, sister chromatid cohesion or centrosome function activates the SAC, and leads to mitotic arrest until the errors are corrected. Failure in satisfying SAC causes cell death, either by mitotic catastrophe or in the next G1 phase. However, there are cases where cells manage to evade cell death after extended periods in mitotic arrest, known as mitotic slippage (3, 4, 32).

During the S phase of the cell cycle the centrosome is duplicated and should then follow on to disjunction and separation in G2, and migration to form bipolar spindles in $M$ phase. A major centrosome dysfunction is its amplification during the $S$ phase, generating several instead of two units, and culminating in multipolar mitosis formation (33). Conversely, at the onset of spindle assembly, sister kinetochores might become attached to microtubules from the same pole (syntelic attachment), or a single kinetochore might be captured by microtubules from both poles (merotelic attachment) (3). Likewise, errors might occur during chromosome segregation, including lagging chromosomes and chromosome bridges and defects in sister chromatid cohesion $(\mathbf{4}, \mathbf{3 4})$. Such errors play key roles in triggering two of the most distinguished characteristics of cancer cells: chromosomal instability and aneuploidy (4).

## Chromosomal instability

Chromosomal instability (CIN) is a hallmark of cancer and refers to an increased rate of chromosome mis-segregation during mitosis (35, 36). A frequent consequence of CIN is aneuploidy (see section below), although they are not synonyms and aneuploid cells can become stable shortly after being originated (3537). CIN can also promote chromosome breaks that result in chromosome structural rearrangements, as well as chromothripsis - a catastrophic event where a
chromosome shatters and gives rise to hundreds of rearrangements in one or several chromosome regions (35). Moreover, chromosomal instability plays an important role in tumor evolution, formation of subclones and drug resistance $(\mathbf{3 5}, \mathbf{3 7})$.

## Aneuploidy

Aneuploidy is classically defined as gains and losses of whole chromosomes, a description that has been recently expanded to numerical changes in whole chromosome arms as well $(\mathbf{3 6}, \mathbf{3 7})$. Although the vast majority of cancer types display some level of aneuploidy $-\sim 90 \%$ in solid and $\sim 60 \%$ in non-solid cancers $(\mathbf{3 7}, \mathbf{3 8})$ - the consequences of these anomalies can be very distinct in different tumor types. Depending on the genomic context and chromosome gains, aneuploidy can both promote or suppress tumor development. It also has high prognostic value, since methods for detecting chromosomal gains and losses can be fast and straightforward, and recurrent aneuploidies are often used for risk stratification (36, 37). An example of how diverse the impact of chromosome gains and losses can be is seen in the clinical outcome of tumors when classifying the degree of aneuploidy. High degree of aneuploidy is associated with poor prognosis in solid tumors, while hypodiploidy has the same effect in hematological malignancies. Hyperdiploidy is favorable in leukemias and lymphomas, while single aneuploidies have different outcomes depending on the involved chromosome and cancer type (37). Aneuploidy has been well-established as an early event that plays a role in tumorigenesis, highlighting its importance and the need for further understanding how it arises and its effects (37, 39, 40).

## Chromosome rearrangements

Large rearrangements in chromosome structure are recurrent features in cancer cells. DNA damage caused by mitotic errors and exogenous or endogenous factors may lead to balanced and unbalanced chromosome translocations, formation of marker chromosomes and ring chromosomes, dicentric and isochromosomes, deletions, duplications and inversions of chromosome regions $(\mathbf{4 1}, \mathbf{4 2})$.

Mitotic errors such as lagging chromosomes trapped during furrow ingression and formation of micronulei from mis-segregated chromosomes pave the way to doublestrand breaks (DSB) in the DNA, and often lead to chromosome translocations and chromothripsis, respectively (42). DNA damage can also be introduced by exogenous sources, such as radiation or chemical exposure, and by endogenous events, among others oncogene activation, oxidative stress and DNA replication stress (41, 42).

Although there are several mechanisms for DNA repair, these can be prone to errors and thus compromise genome integrity, especially in the presence of DSB. Methods such as canonical non-homologous end-joining (C-NHEJ) for DSB repair very often result in chromosome rearrangements, since it ligates any DSB regardless of specificity. Single-strand annealing utilizes long homologous sequences shared by both ends of DSB for repairing, and leads to deletions of repeated regions. Homologous recombination by break-induced replication promotes repair between two DSB that display one homologous side with the template, a mechanism that is considerably prone to error and can lead to loss of heterozygosity, duplications and unbalanced translocations (42).

## Single nucleotide variants

Every DNA molecule has a sequence composed of nucleotide bases, being two purine bases - adenine (A) and guanine (G), and two pyrimidine bases - cytosine $(\mathrm{C})$ and thymine (T). Mutations where one nucleotide substitutes another are known as single nucleotide variants (SNVs), and their majority are harmless, representing natural variability of the human genome. Nevertheless, the position of an SNV and type of base substitution can have dire consequences and affect amino acid coding (43).

Synonymous mutations are substitutions that do not affect the encoded amino acid due to codon bias. Nonsynonymous mutations, which have greater detrimental effects, are further divided into missense mutations when it leads to change in amino acids, or nonsense mutations when it inserts a premature stop codon, resulting in truncated proteins $(\mathbf{4 3}, \mathbf{4 4})$. Similar to aneuploidies and chromosomal rearrangements, point mutations have the potential to affect oncogenes and tumor suppressors - genes that are particularly important in cancer development. Wellknown examples of cancer-related genes often targeted by point mutations are TP53 and $R A S(42,45,46)$.

## Introduction - Part II

## Hematopoiesis

## The history of hematopoiesis

In 1949, a study involving total body X-radiation of mice observed, for the first time, blood cells capable of shielding the subjects from lethal doses of irradiation (47). This was just the beginning that instigated investigations of these remarkable blood forming cells, highly proliferative and capable of regeneration. During the 70 's, a series of studies noted that the same blood cell type had the ability to generate myeloid, erythroid, megakaryocytic, and lymphoid cells (48-50). It was then proposed that the bone marrow must contain a self-renewing, multilineage progenitor cell type, which was then named hematopoietic stem cell (HSC), also giving rise to the concept of the stem cell itself $(\mathbf{4 9}, \mathbf{5 1})$. Today it is known that HSCs are responsible for the production of over 10 different cell types in mammalians, although there is much yet not fully understood in the complex formation of blood cells. Research in genetics has, nonetheless, helped clarify how HSCs take different paths in this differentiation process known as hematopoiesis (52).

## HSCs differentiation

In adults, maintenance of HSCs is carefully regulated by transcription factor genes responsible for production, survival, and self-renewal of these cells, including the well-known RUNX1, KMT2A (former MLL) and GATA2 (53). While a small population of HSCs keep their abilities of self-renewal, others lose this capacity as they go under differentiation, the first step being the formation of a multipotent progenitor (MPP). Downstream progenitor cells slowly become more restricted, as MPPs form the oligopotent progenitors - capable of generating several but not all blood lineages. Traditionally, the common lymphoid progenitor (CLP) will generate B-cells, T-cells, and natural killers (NKs), where IKZF1 (Ikaros) is essential for the
development of all lymphoid cells $\mathbf{( 5 2 , 5 3 )}$. The common myeloid progenitor (CMP) differentiates into two paths: the megakaryocyte/erythrocyte progenitor (MEP), where GATAl is a key gene to determine megakaryocytes (platelets); and the granulocyte/macrophage progenitor (GMP), having SFPII (PU.1) as a master regulator for both granulocyte and monocyte formation (52, 53). Recent studies have, however, resulted in changes in the hematopoietic lineage commitment tree, as dendritic cells (DCs) were found to be formed both by the CLP path, as plamacytoid dendritic cells ( pDC ), and the CMP path, as myeloid dendritic cells (mDC) (54). Likewise, another oligopotent progenitor known as lymphoid-primed multipotent progenitor (LMPP) was discovered, having a combined potential for Bcells, T-cells and granulocytes/macrophages, but no megakaryocyte/erythrocyte potential (55).

## Lymphopoiesis and transcription factor requirements

Through the differentiation process known as lymphopoiesis, a series of steps defining cell fate leads HSCs to give rise to mature T-cells, B-cells, and natural killers (NKs) (56). Among common lymphoid transcription factors, IKZF1 is essential for lymphoid cell development, recruiting chromatin remodeling complexes to DNA regulatory elements, and regulating both self-renewal in HSCs and lineage-specific gene expression $(\mathbf{5 7}, \mathbf{5 8})$. Other factors that are common between B and T lymphopoiesis include GFI1, which inhibits PU. 1 expression in MPP and thus GMP commitment, C-MYB, that regulates IL-7 receptors, and TCF3, necessary for lymphoid-lineage priming in MPPs (57).

While B-cells mature in the bone marrow, when multipotent progenitor cells enter the T-cell commitment pathway they migrate to the thymus according to thymic microenvironmental stimulus $(57,59)$. In contact with ligands in the thymic epithelial cells, the Notch pathway is activated, and signaling will continuously influence T-cell development until they begin to express TCR $\beta$ or TCR $\gamma \delta$ - which will define $\alpha \beta$ T-cells and $\gamma \delta$ T-cells. Other transcription factors that are specific to T-cells are $\mathrm{BCl11B}$, which regulates $\alpha \beta$ T-lineage, GATA-3, taking part in initial specification and TCR $\alpha \beta$-dependent positive selection, and TCF-1, a signaldependent transducer involved in the Wnt pathway (59).

Early B-lineage fate restriction is highly determined by IKZF1, as its extended list of functions also includes promoting B-cell identity and modulating B-cell specific genes (58). The transcription factor TCF3 is required in later stages of development, beyond pre- and pro-B cells, and also regulates expression of the B-lineage specific
transcription factors EBF1 and PAX5. These two transcription factors are fundamental for maintaining B-cell identity as they have collaborative but distinct roles, where EBF1 is required for B-lineage genes expression, and PAX5 has a dose dependent effect on inhibiting NK and T-lineage genes to allow B-cell commitment $(57,58)$.

## Leukemogenesis

Similar to what has been described for tumorigenesis in general, leukemogenesis takes a series of genetic alterations, accumulated over time, to transform normal hematopoietic cells into leukemic cells, and both disrupted differentiation and nonexhaustive proliferation are likely the early basis of leukemia (60). The term preleukemic cells emerged as a definition of the intermediate stage where early genetic events have begun to transform normal hematopoietic cells, however secondary events are yet to come to overt leukemia $(\mathbf{6 0}, \mathbf{6 1})$.

## From hematopoietic stem cells to pre-leukemic cells

The pathogenesis of leukemias have been studied for decades, and as early as the late 60 's, aneuploidies - gain and loss of whole chromosomes - and partial chromosomal aberrations were identified as causatives of these malignancies (61, 62). In acute myeloid leukemia (AML), loss of the long arm of chromosome 5 (5q), including the overlapping region $5 q 31$ was described from several patient samples as an early event, and present in pre-leukemic cells (63). The study from 1989 also investigated genes located in the region, only to find that several growth factors involved in regulating hematopoiesis were mapped to $5 q 31$ and adjacent areas (61, 63). Among others, these included CSF2 and IL3, which sustain viability of early HSCs, CD14 - a surface marker of monocytes and macrophages, and the tumorsuppressor gene EGRI (61).

A more recent study has proposed a model for pre-leukemic cells, discussing evidence that the early events target HSCs. As leukemogenesis is believed to be a long-term process with a prolonged pre-leukemic stage, an early leukemogenic alteration should occur in a self-renewing cell with developmental plasticity or grant self-renewal to a more differentiated cell. In this context, the pre-leukemic HSC would be able to, while still retaining multi-lineage potency, proliferate without exhaustion and give time for additional mutations to accumulate. Ultimately, a secondary driver change emerges, originating leukemic cells that are reprogrammed
to be lineage-restricted as they lose normal functions (60). Evidence of functional pre-leukemic cells harboring early genetic events was described in patients with chronic myeloid leukemia (CML), where the canonical $B R C:: A B L 1$ fusion gene was detected not only in differentiated lymphoid cells but also in HSCs, a fact also corroborated by observations in chronic lymphocytic leukemia (CLL) and acute lymphoblastic leukemia (ALL) (60, 64-72).

Pre-leukemic HSCs require secondary events to become full leukemic cells $(\mathbf{6 0}, \mathbf{6 1}$, 73). Early or first events usually involve genes that affect transcriptional and epigenetic regulators capable of modifying lineage options, including $A B L 1, B C R$, CEBPA, ETV6, PAX5, RARA and RUNX1, among others. The secondary group of mutations frequently offer proliferative or survival advantages by activating signaltransduction pathways, such as alterations in FLT3, RAS or KIT (73). Interestingly, studies suggest that pre-leukemic HSCs are therapy-resistant, possibly taking part in relapse cases. In agreement with this statement, early leukemogenic events were reported to have high concordance between diagnosis and relapse, while second-hit mutations are frequently gained or lost in relapse (60). Infections and immune system modulation have also been suggested to trigger pre-leukemic cells into leukemia, a concept known as delayed infection hypothesis. Briefly, lack of natural infection exposures in infants may hinder modulation or priming of their immune system and may possibly lead to highly dysregulated immune responses when they are exposed to common infections in their second or third year of life (74).

## The origins of childhood leukemia

Accounting for $30 \%$ of all childhood cancers, leukemia is the most common neoplastic disease in children (75). The origin of infant and childhood leukemia has relentlessly puzzled researchers. In fact, many wondered whether pre-leukemic cells emerged before birth. Several studies have shown indisputable evidence that most cases in fact arise in-utero (74, 76, 77). Studies involving monozygotic twins with leukemia were the first indication of in-utero origins, where the siblings were found to share the exact same breakpoints in canonical leukemic fusion genes, suggesting that the leukemia cell of origin arose in one twin fetus and spread to the other twin $\mathbf{( 7 4 , 7 8 )}$. Further evidence was gathered from analysis of archived neonatal blood spots, collected routinely, showing that most cases of pediatric ALL and AML could be detected by fusion genes and other markers in pre-leukemic cells right after birth (74, 77, 79, 80). Lastly, screening of 567 normal blood cord samples in 2002 observed the ETV6::RUNXI fusion in $1 \%$ of cases, approximately 100 times the incidence of childhood ETV6::RUNX1-positive ALL, indicating that functional pre-
leukemic cells arise more often prenatally, but secondary events to overt leukemia are rarer (74, 81).

## Clinical aspects of childhood acute lymphoblastic leukemia

Acute lymphoblastic leukemia is a heterogeneous entity that includes several subtypes, being the most common pediatric malignancy. Apart from the KMT2Arearranged subtype, which occurs most commonly in infants ( $<12$ months old), the age peak of ALL is between 2 and 5 years old (82). The overall survival rate in highincome countries is over $90 \%$, while low- and middle-income countries show a lower range of success (22-79\%) (83). Besides stratification based on genetic subtypes, higher white blood cell count ( $\mathrm{WBC} \geq 50 \times 10^{9} / \mathrm{L}$ ) at diagnosis, age below 12 months or above 10 years old, T-cell immunophenotype and central nervous system (CNS) involvement are considered poor prognostic factors and used for risk assignment (82-84). Treatment of ALL consists of three stages with a duration of 2 to 2.5 years in total. Briefly, the first stage is remission-induction therapy to eradicate the initial leukemic cell burden with a duration of 4-6 weeks, where glucocorticoid (usually prednisone), vincristine and asparaginase are administered. This is followed by intensification (consolidation) therapy that aims to eradicate leukemic residual cells, including administration of cyclophosphamide, cytarabine, and mercaptopurine combined with high dosage of methotrexate (MTX). Lastly, maintenance therapy is carried out for $\geq 1$ year, consisting of daily mercaptopurine and weekly methotrexate with or without vincristine and steroid pulses $(\mathbf{8 2}, \mathbf{8 4})$. The current protocol for treating ALL in children and adolescents in Sweden is the ALLTogether protocol. In 2019 several European study groups, including the Scandinavian program NOPHO, have started this collaborative protocol to enhance ALL treatment in children and adolescents, with a focus on decreasing overtreatment and improving the survival of high-risk cases (85).

## B-cell precursor childhood acute lymphoblastic leukemia

B-cell precursor (BCP) childhood ALL is characterized by proliferation of Blymphoid progenitor cells. It is the most common type of childhood cancer, with a five-year overall survival rate of $90 \%$ (86-88). Approximately $75 \%$ of BCP-ALL cases display aneuploidy or recurrent chromosomal rearrangements that occur as early or first events in leukemogenesis and are used as the basis for classification of
genetic subtypes (89). Genetic aberrations in BCP-ALL commonly disrupt genes related to lymphoid development, such as ETV6 and RUNX1, or activates oncogenes and tyrosine kinases, e.g. $A B L 1$ (82). Additional alterations in B-cell transcription factor genes - e.g. PAX5, IKZF1 and EBF1, causing developmental arrest in proand pre-B-cells, also play an important role in the pathogenesis of the disease, together with mutations in cell cycle and tumor suppressors - CDKN2A/B and TP53, lymphoid signaling - BTLA, TOX, CD200, and regulators of hematopoiesis, such as FLT3 (40, 82, 90). Other frequent targets are genes involved in the RTK-RAS signaling pathway, especially $N R A S, K R A S$ and $P T P N 11$, and histone modifiers such as $C R E B B P(\mathbf{4 0}, \mathbf{8 2}, \mathbf{9 0}, \mathbf{9 1})$. Recent efforts to investigate cases that are not classified within any of the canonical genetic alterations revealed several emerging molecular subtypes in BCP-ALL, such as PAX5-driven alterations, MEF2D rearrangements ZNF384 rearrangements, ETV6::RUNX1-like and BCR::ABL1-like (88). Since these emerging subtypes are not completely settled, the focus of this section will be the well-established genetic subtypes.

## BCR::ABL1-positive

The $B C R:: A B L 1$ fusion gene arises by the rearrangement $\mathrm{t}(9 ; 22)(\mathrm{q} 34 ; \mathrm{q} 11)$, where the $\operatorname{der}(22)$ is called Philadelphia chromosome. Comprising 3-5\% of pediatric ALL cases, $B C R:: A B L 1$ is associated with older age (median of 7.9 years), higher leukocyte count and poor prognosis $(\mathbf{8 9}, \mathbf{9 2})$. This fusion gene increases cell proliferation and dysregulate differentiation, while the most prominent additional alterations are deletions in IKZF1, which occur in more than $80 \%$ of BCR::ABL1 ALL cases and has been associated with treatment resistance in this subgroup. IKZF1 deletions are not present in $B C R:: A B L 1$ CML, suggesting that such alterations are important in the development of $B C R:: A B L 1$ ALL $(\mathbf{8 7}, \mathbf{8 9})$.

## DUX4-rearranged

The recently described $D U X 4$-rearranged BCP ALL is a subtype that accounts for $4-7 \%$ of pediatric cases, and is associated with a good prognosis $(\mathbf{8 4}, \mathbf{8 8})$. The most common fusion gene is $I G H:: D U X 4$, while $E R G: \because D U X 4$ is rarer. DUX4 is overexpressed in this subtype, although not expressed in normal B-cells due to its specific role in embryonic development regulation $(\mathbf{8 8}, \mathbf{9 3})$. Whereas IKZF1 deletions are often (40-50\% of the events) associated with poor prognosis in other BCP ALL subtypes, deletions targeting this gene are favorable in $D U X 4$-rearranged cases. Moreover, deletions in $E R G$ also associates with better outcome $\mathbf{( 8 4 , 8 8 )}$.

Both $I G H:: D U X 4$ and $E R G:: D U X 4$ result in a truncated DUX4 protein which varies in length from patient to patient, but retains its DNA-binding properties (93).

## ETV6::RUNX1-positive

The most common fusion gene in pediatric BCP-ALL is ETV6::RUNX1, caused by the rearrangement $\mathrm{t}(12 ; 21)(\mathrm{p} 13 ; \mathrm{q} 22)$. Accounting for $25 \%$ of childhood ALL cases, this subtype has superior molecular response to treatment, thus being associated with favorable prognosis. Nevertheless, late relapses - several years after treatment cessation - occur in up to $20 \%$ of patients, while very early relapses are rare (94). The ETV6::RUNXI fusion gene is a primary event in leukemogenesis, and may convert RUNXI to a transcriptional repressor, as well as activate JAK-STAT signaling downstream. Recurrent second events include deletions in PAX5, EBF1, and the second copy of ETV6, and additional mutations are also seen in BTLA, TOX and $B T G 1$, among others (89).

## Intrachromosomal amplification of chromosome 21 (iAMP21)

Intrachromosomal amplification of chromosome 21 (iAMP21) has an incidence of up to $2 \%$ in BCP ALL cases, with a median age of 9 to 10 years at diagnosis, low white blood cell count, a 5-year event-free survival rate of $\sim 30 \%$ and overall survival rate of $\sim 70 \%(\mathbf{8 9}, \mathbf{9 5}, \mathbf{9 6})$. The subtype is characterized by a highly complex region on chromosome 21 , mainly located between 32.8 and 37.9 Mb , with various regions of amplification, inversions and deletions in a phenomenon known as breakage-fusion-bridge, usually followed by chromothripsis, and which are heterogeneous among patients. The hallmark that defines a case as iAMP21 is to have three or more extra copies of $R U N X 1(\mathbf{8 9}, \mathbf{9 5})$.

## KMT2A-rearranged

Rearrangements involving $K M T 2 A$ correspond to $3-4 \%$ of childhood BCP ALL, occurring in $70-75 \%$ of infants, and there is strong evidence that this subtype has prenatal origin $(\mathbf{8 4}, \mathbf{8 8}, \mathbf{9 7})$. It is considered a high-risk subtype with poor outcome, where the long-term event-free survival rate is less than $60 \%$. Approximately 130 genes transcripts from $K M T 2 A$ rearranged with over 90 different partner genes have been described, where the most common translocations are $\mathrm{t}(4 ; 11)(\mathrm{q} 21 ; \mathrm{q} 23)$ KMT2A::AFF1, t(11;19)(q23;p13.3) - KMT2A::MLLT1, and t(9;11)(p21;q23) -

KMT2A::MLLT3 $(\mathbf{8 8}, \mathbf{9 7})$. While KMT2A maintains homeotic gene expression in hematopoiesis, additional genetic alterations are uncommon in this subtype (89).

## Low hypodiploid and near-haploid

Low hypodiploid BCP ALL includes aneuploid cases with 31-39 chromosomes, with a frequency of $1 \%$ in pediatric cases (84) and poor prognosis. It harbors deletions in IKZF2, and high frequency of TP53 mutations, frequently constitutional, which are otherwise rare in $\operatorname{BCP} \operatorname{ALL}(\mathbf{8 4}, 89)$. Additionally, low hypodiploid cells often double and form near-triploid clones (98).

Near-haploidy (24-30 chromosomes) is also a rare aneuploid subtype of BCP ALL, with a frequency of $2 \%$ in children and poor prognosis $(\mathbf{8 4}, \mathbf{9 9})$. Mutations in the RAS signaling pathway are very frequent, as well as $I K Z F 3$ deletions $(\mathbf{8 4}, \mathbf{8 9})$. This subtype can often be mis-diagnosed due to the presence of duplicated hyperdiploid clones, which are characterized by disomies and tetrasomies, and frequent gains of chromosomes X, 14, 18 and $21(\mathbf{6 2 , 9 9})$.

## TCF3::PBX1-positive

TCF3::PBX1 ALL - caused by $\mathrm{t}(1 ; 19)(\mathrm{q} 23 ; \mathrm{p} 13)$ - comprises $6 \%$ of childhood BCP ALL cases, with a median age of 7, and displays more frequent CNS relapse. Historically, the prognosis for the subtype was poor, which has changed with more recent treatment regimens $(\mathbf{8 4}, \mathbf{8 9})$. This translocation is often unbalanced and, as a consequence of this rearrangement, the subtype often displays gains of 1q. TCF3 plays an important role in lymphoid development, and the $T C F 3:: P B X 1$ fusion gene disrupts HOX-regulated gene expression, which affects hematopoietic differentiation (89).

## High hyperdiploid (HeH)

High hyperdiploid $(\mathrm{HeH})$ is the largest subtype of childhood BCP ALL ( $\sim 30 \%$ ), and accounts for hyperdiploid cases with 51-67 chromosomes that display a non-random gain of chromosomes $X, 4,6,10,14,17,18$ and 21 . With a median age of $\sim 4$ years, this subtype is characterized by low white blood cell count, usually below $10^{9} / \mathrm{l}$, rare instances of extramedullary leukemia (less than 5\%), and mostly lymphoblasts with L1 morphology (62, 100).

Trisomy or tetrasomy 21 occur in all HeH ALL cases, followed by gains of chromosome X with an incidence of $90-95 \%$, and, in order of likelihood, gains of chromosomes $14,6,18,4,17$, and 10 . Notably, class-defining genes of this subtype are located predominantly in chromosomes 21 and $X(62,100-102)$. Cases from this subtype display low frequency of subclonality, usually involving gains or losses of 1 to 3 whole chromosomes, or additional structural rearrangements (62). Evidence suggests that the aneuploidy itself is the main driver change in HeH ALL, causing dosage effects - increased expression of genes located in the gained chromosomes, but that additional mutations are required to overt leukemia. Studies have showed that high hyperdiploidy has pre-natal origins in most, if not all, cases $\mathbf{( 7 8 , 1 0 3 )}$. Furthermore, analysis of mutational patterns among homologues in trisomies showed that the majority of mutations arise after chromosome gains, reinforcing that aneuploidy is the first hit in HeH ALL leukemogenesis (40, 62).

Other key characteristics of classical HeH includes 2:2 allelic ratios of tetrasomies in virtually all cases and common ( $\sim 30 \%$ ) loss of heterozygosity through uniparental isodisomy in whole chromosomes (wUPID) - both chromosomes of a disomy come from the same parent, where wUPID 9 occurs more often (40, 62, 102). Structural rearrangements are observed in $\sim 50 \%$ of HeH ALL cases, where the most frequent unbalanced events - rearrangements that result in gain or loss of genetic material are gains of 1 q , deletions in 6 q , and isochromosomes of 7 q and $17 \mathrm{q}(\mathbf{6 2})$.

The most targeted metabolic pathway in HeH ALL is the RAS pathway (40, 62, 100). The RAS-RAF-MEK-ERK pathway is responsible for extracellular signaling to intracellular substrates, playing a role in regulation of cell proliferation and differentiation (104). The commonly targeted genes of the Ras pathway in HeH cells are KRAS, NRAS, FLT3 and PTPN11, being present in $50 \%$ of the cases. Histone modifiers and chromatin-remodeling genes are also frequently targeted in this subtype ( $20 \%$ of the cases), including CREBBP, WHSC1, SUV420H1, SETD2 and $E Z H 2(40,100)$. In regard to germline mutations and susceptibility, the most relevant affected gene in HeH ALL is ARID5B, an epigenetic activator of gene expression and regulator of cell cycle that is essential for normal lymphocyte development (100, 102).

Since HeH ALL is associated with a favorable prognosis, early identification of higher-risk cases is important to prevent treatment failures and relapses, while providing a chance for deintensification of the remaining cases with better prognosis. Higher chromosome number, more than 53/55 chromosomes, is related to superior prognosis. Likewise, the presence of the so-called triple trisomies $(+4$,
+10 and +17 ), as well as concurrent +17 and +18 or $+17 /+18$ in the absence of +5 and +20 , leads to better outcome $(62,100,105)$. Conversely, the intronic risk allele rs7090445-C in ARID5B is associated with drug resistance and increased relapse, and mutations in $K R A S$ and $C R E B B P$ often co-exist in relapsed clones $(\mathbf{9 1}, \mathbf{1 0 0})$. Recently, a study has showed that HeH cases with $56-67$ chromosomes and with triple trisomies are highly sensitive to asparaginase, cytarabine, mercaptopurine and thioguanine, while cases with +7 and +9 were resistant to asparaginase, reinforcing the importance of investigations for case-specific treatments $(\mathbf{1 0 6}, \mathbf{1 0 7})$.

## The present investigation

## Aims

The overall aim of this thesis was to investigate the molecular pathogenesis of HeH childhood ALL, focusing on the global effects of hyperdiploidy, its nature and origin, and ultimately to shed light to its role in leukemogenesis. More specifically, the individual aims of the included articles were:

## Article I

To determine the effects of aneuploidy on gene expression, protein levels and chromatin architecture in HeH ALL.

## Article II

To investigate the incidence of sister chromatid cohesion defects and chromosome copy number variation in HeH ALL.

## Article III

To explore the 3D genomic landscape of different subtypes of BCP ALL, its relationship with genomic features and its effects on the transcriptome.

## Article IV

To investigate the clonal heterogeneity of HeH ALL at the single cell level, and to elucidate the origin of high hyperdiploidy.

## Methods

## Cytogenetics and cell biology techniques

## Classic cytogenetics

In 1956, Tjio and Levan published their work of identifying the diploid number of human chromosomes at Lund University (108). The following years expanded our knowledge of the 46 chromosomes, and soon the term cytogenetics was invented to define the study of chromosomes. Classic cytogenetics has long been used to investigate changes in chromosomes, as genetic disorders and tumors began to be correlated with chromosome gains and losses as well as structural chromosome changes. Before the discovery of banding techniques, human chromosomes were divided into groups from A to $G$ based on their size and centromere position, however it was difficult to infer more about the individual chromosomes within groups (109). Then in 1968, Caspersson developed the first chromosome banding technique using quinacrine-based fluorescent dye, which was named Q-banding. The Q-banding revealed that each chromosome has a unique banding pattern, which led to the identification of all human chromosomes and rapid development of other banding techniques, as well as the publication of the first banded human karyogram in 1970. Currently, G-banding is the most commonly used banding technique due to its permanence and clarity when compared to Q-banding fluorescent patterns (110).

Since 1960, the International System for Human Cytogenetic Nomenclature (ISCN) has been used by cytogeneticists world-wide to describe human chromosomes in a concise way. It includes idiograms for every chromosome, identifiable bands in different banding resolutions, definition and abbreviation of chromosome abnormalities, and how a karyotype should be written down (111). Chromosomes are divided at the centromere into short arm (p) and long arm (q). Based on Gbanding patterns, chromosome regions are divided into bands and consecutive subbands, and given a numerical designation according to their distance from the centromere (112). The cytogenetic techniques used in this thesis will be described below.

## Cytogenetic slide preparations

In order to analyze mitotic chromosomes using microscopy, it is necessary to harvest cells and prepare them before producing slides with metaphase spreads. There is variation in protocols between different laboratories in terms of reagents, incubation time and concentrations, and based on the cell type being used. However, all protocols follow the same principles, and the main steps remain similar. Briefly, cultured cells are incubated with Colcemid to arrest them in metaphase and increase the number of metaphase chromosomes for analysis. The next step is to make cells swollen so they burst and chromosomes spread more easily on the slide, a procedure that involves incubation with a hypotonic solution, usually 0.075 M KCl for lymphoblasts. Afterwards, cells are washed 2-3 times with fixative solution, consisting of $3: 1$ methanol:acetic acid. Fixed cells, commonly referred to as fixatives, can be stored at $-20^{\circ} \mathrm{C}$ for decades, or directly used for slide preparation by dripping a few drops on a glass slide and letting it air dry. Slides with metaphase spreads can also be stored at $-20^{\circ} \mathrm{C}$, or used directly for staining. If not stored, slides must be aged before staining to ensure that metaphase chromosomes will not degrade, and aging can be achieved by air drying the slides for a couple of days, microwaving them for 1 to 2 minutes or placing them on a $60^{\circ} \mathrm{C}$ slide oven overnight.

## G-banding

The G-banding technique was described in 1971 by Drets and Shaw, as they noticed that treating metaphase spreads with NaOH followed by sodium chloride-trisodium citrate and staining with Giemsa resulted in chromosome banding patterns (113). Such a technique created dark bands where chromosomes had lower G-C content, alternated by lighter interbands. G-banding formed banding patterns equal but opposite to Q-banding, meaning that G-banding lighter interbands were the stained darker bands in Q-banding. G-banding became preferably used rather than Qbanding since it was fluorescence-free and could be analyzed in a classic optical microscope (112, 113).

## Fluorescence in situ hybridization (FISH)

The first technique of in situ hybridization (ISH) for labeling specific DNA regions on metaphase chromosomes was described in 1969, using radioactive labeling as the principle (114). In the 1980's and early 1990's, the field of molecular cytogenetics spread as researchers discovered that DNA could be labeled with biotin, and fluorochromes - fluorescent dyes - were developed for a safer, nonradioactive DNA-labeling, known as fluorescence in situ hybridization (FISH)
(112). Suitable for both metaphase chromosomes and interphase cells, most FISH protocols consist of pretreating the cytogenetic slides with SSC buffer followed by pepsin to enhance permeability. Fluorescent probes are dripped on the slide, which is shortly incubated at high temperatures $\left(\sim 72^{\circ} \mathrm{C}\right)$ for DNA denaturation followed by a long incubation time at $37^{\circ} \mathrm{C}$ for hybridization. After washing, slides are commonly counter-stained with DAPI and can then be analyzed on a fluorescence microscope. Commercially available probes vary in color, which allow multiple regions to be inquired simultaneously, and can be sequence-specific or whole chromosome paint (WCP).

## Cohesion defects assay

As described in the introduction of this thesis, the normal progression of the M phase in cell division includes the alignment of mitotic chromosomes in the metaphase plate, where kinetochores of each sister chromatid are attached to microtubules from opposing poles (3). The cohesin complex counteracts the pulling forces of microtubules by keeping sister chromatids united or cohesed, a mechanism that is essential to pass the SAC checkpoint and ensure proper chromosome segregation. Premature separation of sister chromatids, still in metaphase, may cause chromosome mis-segregation and lead to aneuploidy (8). Sister chromatid cohesion defects began to be quantified in a systematic way by Barber in 2008 (34) to measure the effects of cohesion-related genes in colorectal cancer cell lines, which was similarly done by Sajesh in 2013 using Hodgkin lymphoma cell lines (115). In both studies, the term primary constriction gap (PCG) is used to describe gaps between the centromeres, a clear sign of premature separation of sister chromatids during metaphase (Figure 3). Although mitotic chromosomes are either cohesed or not, cohesion defects as a whole can exist at different levels. We can measure the severity of cohesion defects by counting the number of chromosomes displaying PCG in a single cell, and cells within a case can have different scores, meaning that a patient case may have from mild to very severe defects, or perhaps zero to severe defects. One can also picture the overall incidence of cohesion defects by taking the average of cells with any level of PCG and presenting the result as total percentage of PCGs.

In this thesis, we measured both total percentage of PCGs and severity of defects, based on the PCG classification used by Barber and Sajesh (34, 115), with modifications we found pertinent when analyzing high hyperdiploid cells. Using both FISH slides stained with DAPI and G-banded slides for analysis, we classified the severity of cohesion defects per cells as follows: PCG-I (mild), 1-4 chromosomes with PCGs; PCG-II (moderate), 5-19 chromosomes are affected; PCG-III (severe), 20 or more, but not all, chromosomes are affected; PCG-IV (very severe), complete loss of sister chromatid cohesion.


Figure 3 | Detection of sister chromatid cohesion defects. Illustrations (above) and microscopy pictures (below) of how we performed the cohesion defects assay to detect premature separation of sister chromatids during metaphase in leukemic samples. A completely cohesed mitotic chromosome shows no gaps between their duplicated (sister) chromatids. When cohesin fails to keep sister chromatids together at the onset of metaphase, we can observe a space or primary constriction gap (PCG) in the middle of the chromosome, indicative of defective cohesion. On the same cell under metaphase, there can be cohesed chromosomes and chromosomes with PCGs. The number of chromosomes displaying PCGs can be used to measure the severity of cohesion defects on a cell. Created using Biorender and pictures from our own patient cohort.

## Chromosome morphology study

A common opinion among cytogeneticists is that leukemic cells have poor metaphase chromosome morphology when compared to normal cells, and HeH ALL cells have particularly bad chromosome morphology. Therefore, we developed a method to score metaphase chromosome morphology in order to compare average scores between different BCP ALL subtypes in a quantitative way. As classic cytogenetics may be subjected to the eyes of the analyst, we established features that should be accounted for when classifying chromosome morphology, which
includes chromosome condensation, band resolution, and overall shape and appearance.

The chromosome morphology score (CMS) is preferably assessed in G-banded slides, and each cell is scored as follows (Figure 4): CMS 1 - poor morphology, where chromosomes are too condensed to display any substantial banding pattern, are difficult to identify, and have poorly-defined shape, usually with a "fuzzy" appearance; CMS 2 - fair morphology, where chromosome resolution is approximately 200-300 bands, chromosomes are less constricted and have a sharper appearance, facilitating their identification; CMS 3 - good morphology, where chromosomes are long and display banding patterns above 350 bands, with welldefined shape allowing easy karyotyping.


Figure 4 | Chromosome morphology score. Illustrations/Idiograms (above) and microscopy pictures (below), using chromosome 1 as an example, of how we analyze mitotic chromosome morphology (Chromosome morphology score, CMS). Each cell receives an average score based on all of its chromosomes, ranging from 1 (poor) to 3 (good). Band resolution, level of compaction and overall shape are considered when scoring chromosome morphology. Created using Biorender and pictures from our own patient cohort.

## Immunofluorescence

Immunofluorescence can be applied in a wide variety of tissues and cell types, and target many different components using antibodies tagged with fluorochromes, which can then be visualized by fluorescence microscopy (116). In this thesis, I utilize immunofluorescence to visualize microtubules and centrosomes during mitosis and investigate the incidence of mitotic defects in leukemic cell lines with low cohesin expression.

Briefly, a poly-L-lysine coated glass slide should be used for preparation of nonadherent cells, such as lymphoblasts. The cell suspension is incubated on the coated slide, followed by incubation with paraformaldehyde, a less aggressive fixative agent that ensures cells remain intact. The slides are then treated with a blocking solution based on bovine serum albumin (BSA) to minimize unspecific antibody absorption. Afterwards, slides are incubated with primary antibodies, which in our studies were targeting microtubuli (anti-tubulin alpha) and centrosomes (antitubulin gamma). Lastly, we perform incubation with secondary antibodies compatible with the primary ones (i.e. same donor species) and that are conjugated with fluorochromes, and slides are mounted with DAPI before microscope analysis.

## Gene knockdown using short hairpin RNA (shRNA)

Many functional studies wish to investigate the effect on live cells of lowering the expression (knockdown) or deactivating (knockout) a target gene, and the use of RNA interference (RNAi) has become a very popular and powerful tool for such purposes. The procedure consists of delivering double-stranded RNA - identical to the target sequence - to the cell, leading to degradation of the host messenger RNA (mRNA) and thus affecting the gene expression of the target. Among other options for shRNA vector production and delivery, lentiviral-mediated transduction is a popular choice since it is straight-forward and less toxic for the targeted cells (117). After vector production, the lentivirus is added to cultured cells for the transduction, including a 60 -minute centrifugation step and overnight incubation at $37^{\circ} \mathrm{C} \mathbf{( 1 1 8 )}$. The transduced cells - which now contain a fluorescently labelled vector - are sorted by fluorescence-activating cell sorting (FACS) after 48 hours, cultured for one week, and quantitative PCR (qPCR) is performed to inquire the expression level of the targeted gene, or knockdown efficiency.

## Proteomic techniques

## Mass spectrometry

Mass spectrometry (MS) is an indispensable tool in proteomic studies, among other fields, due to its ability of both quantifying and identifying proteins, which can be used to investigate protein expression levels (119). The sample preparation for MS usually involves as main steps protein precipitation and filtration, phase extraction and affinity enrichment. When samples are loaded into the mass spectrometer, they go through a first stage of ionization, followed by separation of ions based on their mass-to-charge ratio. Finally, ions are measured and can be visualized in a mass spectrum chart (120). Single-stage MS is commonly used when the focus of a study is to measure the molecular mass of a polypeptide. However, to retrieve information about posttranslational modifications or amino acid sequences, tandem mass spectrometry (MS/MS) is performed instead. In MS/MS, selected ions are fragmented through collision after mass determination, and analysis of the masses of such fragments will generate information about additional structural features of the targeted peptides (119).

## Genotyping and sequencing-based techniques

## Single-nucleotide polymorphism (SNP) array

Single-nucleotide polymorphism (SNP) array analysis, which was first developed for SNP typing to enable genome-wide association studies (GWAS), is a genomewide genotyping method that uses a large number of allele-specific probes synthetized on microarrays and is often used to detect copy number alterations (CNAs) and allelic imbalances. SNP array can only detect alterations that cause copy number changes, missing balanced chromosome rearrangements. Another limitation of this technique is that one cannot infer the exact position of an alteration, but rather in which SNP range it is located. Nevertheless, this method is very costefficient, allows rapid and high-throughput information on CNAs and it can detect loss of heterozygosity caused by UPIDs (121).

## Next-generation sequencing

The first-generation sequencing method known as Sanger sequencing was described in 1977, using chain-terminating labelled dideoxynucleotides, fragmentation and size separation to sequence DNA strands based on a DNA template (122, 123). As this method was time-consuming, expensive, and limited in terms of depth, there were constant efforts to develop new technologies. In the early 2000's, next generation sequencing (NGS) emerged, allowing high-throughput parallel sequencing of single DNA molecules. Briefly, NGS is based on short reads, where samples are fragmented, DNA ends are repaired and ligated with adapters, followed by surface attachment and in situ amplification, in a way that millions of sequencing reactions occur simultaneously. Third-generation sequencing refers to long-read sequencing approaches, capable of reading fragments of up to 10 Kb , and such technologies are superior to short-read NGS in terms of de novo assembly, handling genome-wide repeats and structural variants detection (123).

Usually, considering that both forward and reverse reads of a DNA template in a library have equal probability of being sequenced, NGS methods sequence only one end of the DNA templates (124). However, forward and reverse reads can be paired to map both ends of DNA fragments. In mate-pair sequencing, library preparation includes circularizing and biotin-labelling the DNA ends that were brought together, followed by further fragmentation, and allowing mapping of long-distance genomic regions, which is advantageous for interrogating whole genomes with less sequencing coverage (124, 125). In paired-end sequencing, DNA is fragmented, repaired and ligated with adapters, then both ends of a linear DNA fragment can be mapped. Since the distance between each paired read is known, paired-end sequencing allows higher coverage and better mapping over repetitive regions (124, 126).

## Whole-genome sequencing (WGS)

Whole-genome sequencing (WGS) is a powerful tool for genome-wide investigations and has been paramount to study cancer biology. This method can be used for sensitive detection of small variants, copy number variations, loss of heterozygosity and structural variants. WGS can be used to inquire functional predictions, mutation signatures, pathway integration and therapeutic targets, making it one of the most complete approaches for in-depth cancer research. Although efficient, WGS is very expensive compared to targeted deep sequencing
due to the sequencing depth and amount of data required to study the whole genome (127).

## Whole-exome sequencing (WES)

Whole-exome sequencing (WES) has become the most popular targeted enrichment approach among sequencing methods. It consists of sequencing all gene-coding regions, or exons, of the genome, being far more feasible since it requires approximately $2 \%$ of sequencing load compared to WGS. Although genomic information from non-coding regions is not accounted for, $85 \%$ of disease-related mutations occur within exons, and since the whole exome is sequenced, there is no need for selection of candidate genes, a requirement of other targeted methods (128).

## Single-cell whole-genome sequencing (scWGS)

Single-cell sequencing methods have emerged in the early 2010's as a powerful tool to study subtle differences in the genome using NGS at the single cell level. The approach requires single-cell isolation, usually by FACS, DNA extraction and amplification, and library preparation, followed by high-throughput sequencing. In terms of application, scWGS is frequently used for investigating tumor heterogeneity, clonal evolution, and chromosomal instability in cancer. Moreover, single-cell technology can also be coupled with RNA sequencing and epigenetic analysis for in-depth transcriptome and methylome studies (129).

## RNA sequencing (RNA-seq)

Not long after the emergence of NGS, RNA sequencing was developed as a way to study gene expression, translation, and RNA structure. Sample preparation includes RNA extraction, mRNA enrichment and cDNA synthesis, followed by the usual NGS library preparation. The sequencing depth required, even for high-throughput studies, is considerably lower when compared to WGS, ranging from 10 to 30 million reads per sample. RNA-seq is commonly used in cancer research for differential gene expression (DGE) studies and for fusion gene detection, since detecting structural rearrangements at the genome level does not necessarily mean that a fusion gene will be translated (130).

## High-throughput chromosome conformation capture (Hi-C/Micro-C)

Chromatin architecture at the interphase level can be investigated through chromosome conformation capture (3C) methods. In the early 2000's, genome-wide 3C methods began to be developed, using proximity ligation as its basis (21). Briefly, intact nuclei are submitted to covalent crosslinking to bind genomic loci that are physically close in the 3D setting of the cell. The chromatin is then fragmented using restriction enzymes (used in $\mathrm{Hi}-\mathrm{C}$ ) or micrococcal nuclease (MNase) (used in Micro-C), and usual NGS library preparation is carried out for paired-end sequencing (Figure 5). The greatest difference between Hi-C and MicroC that impacts resolution is the enzyme digestion. While restriction enzymes cleave DNA only in their specific recognition sites, resulting in uneven coverage of the genome, MNase recognizes nucleosomes and cleaves DNA into mono-, di- and trinucleosomes, which guarantees a better coverage and nucleosome-level resolution (131). Both $\mathrm{Hi}-\mathrm{C}$ and Micro-C require deep sequencing to allow visualization of fine-scale chromatin structures. While 600 million reads suffice for WGS studies, genome-wide 3C methods often surpass 1 billion reads.


Figure 5 | Micro-C protocol for generating 3D genomic data. Proximity ligation-based Micro-C protocol, that begins with fixing live cells to crosslink genetic regions that are in contact in the 3D setting of the nucleus. MNase is used to fragment the crosslinked DNA, followed by quality control check to ensure that fragments have sizes corresponding to mono-, di- and trinucleosomes. Afterwards, bridge ligation is performed followed by crosslink reversal, resulting in hybrid, linear fragments in which library preparation can be normally carried out for pair-end sequencing. A shallow pair-end sequencing is performed first to ensure the quality of the libraries, followed by high-throughput sequencing. Finally, bioinformatic tools are used for identifying chromatin structures and generating contact maps that will be used for analysis.

## Results

## Article I

## Proteogenomics and $\mathrm{Hi}-\mathrm{C}$ reveal transcriptional dysregulation in high hyperdiploid childhood acute lymphoblastic leukemia

In Article I, we performed analyses on matched datasets of WGS/WES/SNP array and RNA-seq including 48 HeH and 41 ETV6::RUNXI ALL primary samples, and proteomic analysis of 18 HeH and 9 ETV6::RUNXI cases using liquid chromatography MS/MS. We detected 8222 proteins that were ascertained by RNAseq, and expression levels were positively correlated for $75 \%$ of the mRNA-protein pairs. By comparing the mean RNA and protein expression according to the copy number of HeH cases, we observed a clear dosage effect - genes and proteins with higher copy number displayed higher expression, although a negative correlation between gained chromosomes and expression was seen in $16 \%$ of the genes and $25 \%$ of the proteins. Moreover, RNA expression of 83 cases from a previous study was used to investigate cis - genes within a region - and trans - genes in other genomic regions - dosage effects of the copy number gains in HeH ALL, which showed that chromosome gains have a genome-wide impact on gene and protein expression, but with no correlation with known cancer driver genes.

The proteomic landscape of HeH and ETV6::RUNXI ALL are different from each other, as shown by hierarchical cluster and principal component analysis (PCA) in our study. The HeH subtype displayed upregulation of 2423 genes and 1286 proteins, and downregulation of 2222 genes and 1127 proteins compared to ETV6: $:$ RUNX1 cases. Top differentially expressed proteins included known players in ALL, including previously reported high expression of CD44 and FLT3 in HeH ALL, and IGF2BP1, CLIC5, RAG1 and RAG2 in ETV6::RUNX1 ALL. Investigation of pathway dysregulation by gene set enrichment analysis showed that pathways related to translation and ribosomes, innate immunity, cell adhesion, cytokines and activated signaling, protein folding and proteolysis, and the endosome are enriched in HeH ALL. Meanwhile, enriched pathways in ETV6::RUNX1 ALL
included chromatin organization and modification, G2/M checkpoint and mitochondria.

Our proteogenomic analysis further revealed that CTCF and members of the cohesin complex display low levels in HeH compared to ETV6::RUNX1 ALL and normal B-cells. We could also show that the DEG between HeH and ETV6: :RUNX1 were strongly correlated to CTCF binding sites, indicating that CTCF and cohesin levels have genome-wide effects in HeH ALL. We further explored this matter by using publicly available data to compare the expression of gene pairs that belong to the same TAD versus genes separated by TAD boundaries, as genes within a TAD should be similarly regulated. All datasets, which included childhood ALL cases ( $\mathrm{n}=201$ ), AML cases $(\mathrm{n}=151$ ) and papillary renal-cell carcinoma ( $\mathrm{n}=270$ ), showed higher correlation between gene expression of gene pairs from the same TAD. When performing the same type of analysis in our HeH and ETV6::RUNX1 ALL cases, the HeH samples showed no difference in expression of inter- and intra-TAD gene pairs, and such results did not change when analyzing only commonly gained or non-gained chromosomes.

In light of our findings, we next performed $\mathrm{Hi}-\mathrm{C}$ in four HeH and two ETV6::RUNX1 ALL primary samples from our cohort. At the A/B compartment level, HeH cases were $90 \%$ similar to publicly available Hi-C data from the GM12878 cell line, and 98\% similar to ETV6::RUNX1 cases. At the TAD level of resolution, three out of the four HeH ALL samples displayed longer TAD structures and fewer boundaries compared to ETV6::RUNX1 ALL, a result from partial TAD fusions. Weakened or absent TAD boundaries were frequently seen in at least two HeH ALL cases (131 boundaries in total, $97 \%$ overlap with CTCF binding sites), while ETV6::RUNX1 samples were missing only 14 TAD boundaries. Additionally, a total of $134(45 \%)$ genes and $65(31 \%)$ proteins encoded within 1 Mb of boundary losses were differentially expressed between HeH and ETV6::RUNX1 samples, and were more often down-regulated in HeH ALL. Analysis of boundary strength by directionality index and insulation scores showed that TAD boundary positions that remained unchanged between the two ALL subtypes lost strength in some of the HeH samples ( 2 out of 4), further confirming the relationship between abnormal chromatin architecture and transcriptional dysregulation in at least some HeH ALL cases. Lastly, we investigated whether chromosome architecture at the metaphase level was also disorganized in HeH ALL by scoring chromosome morphology in a total of 37 HeH and 33 ETV6::RUNX1 samples. Comparison of mean CMS revealed that mitotic chromosomes display significantly poorer morphology in HeH ALL than ETV6::RUNX1, in line with the Hi-C and RNA-seq data.

## Article II

## Sister chromatid cohesion defects are associated with chromosomal copy number heterogeneity in high hyperdiploid childhood acute lymphoblastic leukemia

In Article II, we performed knockdown of the cohesin member RAD21 in REH cells, an ETV6::RUNX1-positive ALL cell line, and analyzed the incidence of cohesion defects. The RAD21-knockdown (RAD21-KD) cells displayed a higher percentage of PCGs compared to controls ( $33-36 \%$ versus $4 \%$ in control cells) as well as higher severity, ranging from PCG I-III (only PCG I seen in control cells). Next, we carried out the cohesion defects assay on primary samples of $\mathrm{HeH}(\mathrm{n}=45)$ and ETV6::RUNXI (n=37) ALL, where PCGs were detected in $86 \%$ and $49 \%$ of the cases, respectively. The incidence and severity of cohesion defects in the HeH ALL subtype ranged from $0-85 \%$ of total PCGs and from mild defects to complete loss of cohesion (PCG I-IV), although moderate defects or PCG II were the most common ( $40 \%$ incidence). ETV6::RUNX1 ALL cases displayed from $0-18 \%$ of total PCGs and predominantly mild (PCG I) defects.

Afterwards, we performed interphase FISH on HeH samples classified as high PCG levels versus low PCG levels to examine whether cohesion defects were associated with chromosome copy number heterogeneity. We compared copy number changes of chromosomes $\mathrm{X}, 2,3,6,10$ and 21 on cases that shared the same ploidy for the given chromosome, where HeH ALL samples with high PCG levels displayed significantly higher copy number heterogeneity for chromosomes $3,6,10$ and 21 . Similar analysis on the RAD21-KD cells versus control showed increased copy number variation for chromosome 21 in knocked down cells, but not for chromosomes X, 2 and 3. Immunofluorescence was also performed in the RAD21KD and control cells, and while no disturbances were found in control cells, the RAD21-KD cells displayed $6.5 \%$ of mitotic aberrations, including lagging chromosomes/chromatin bridges, and mono-, tri- and tetrapolar mitoses.

Finally, we combined our cytogenetic data with RNA-seq data (HeH n=36; ETV6::RUNX1 n=32) from previous studies to infer whether sister chromatid cohesion defects were associated with levels of cohesin, condensin, or both. By classifying cases into low or high mRNA expression per gene, we compared the PCG percentage of cases from each group and found that low expression of RAD21 is associated with higher PCG levels. Likewise, low expression of the condensin subunit $N C A P G$ correlated with incidence of cohesion defects.

## Article III

## The 3D genome of pediatric B-cell precursor acute lymphoblastic leukemia

In this study we used the genome-wide 3C method Micro-C to investigate the chromatin architecture of 33 BCP ALL primary patient samples with matched RNAseq and cytogenetic analyses, including the genetic subtypes $\mathrm{HeH}(\mathrm{n}=14)$, ETV6: $:$ RUNX1 ( $\mathrm{n}=8$ ), TCF3: $: P B X 1$ ( $\mathrm{n}=4$ ), DUX4-rearranged ( $\mathrm{n}=2$ ), BCR: $: A B L 1$ $(\mathrm{n}=1)$, iAMP21 $(\mathrm{n}=1)$, KMT2A-rearranged $(\mathrm{n}=1)$, near-haploid $(\mathrm{n}=1)$ and neartriploid ( $\mathrm{n}=1$ ). We profiled the A/B compartments of BCP ALL cases and compared them to publicly available Hi-C data from peripheral blood mononuclear cells and CD34+ HSC samples (referred to as normal cells). We observed that BCP ALL cases have significantly less open chromatin than our normal cells control, and among the BCP ALL genetic subtypes, ETV6::RUNX1 cases displayed the least amount of open chromatin. We also observed a negative correlation between levels of open chromatin and both TAD boundary strength and total number of TADs. We further examined A/B compartments shifts between the $\mathrm{HeH}, E T V 6:: R U N X 1$ and $T C F 3:: P B X 1$ cases, identifying 235 genes located in such regions, and discovered that the first two subtypes were more similar than the latter, and compartment shifts were accompanied by changes in gene expression.

In regard to TAD organization, we identified 10318 TAD boundaries at 25 kb resolution. PCA based on TAD boundary strength revealed that the three main genetic subtypes of our cohort form separate clusters. Cluster 1 comprised all aneuploid cases except the near-triploid, i.e. HeH cases, a near-haploid and a $B C R:: A B L 1$ case with 51 chromosomes. Cluster 2 included all ETV6 $:: R U N X 1$ cases together with the iAMP21 case and one DUX4-rearranged case with an ETV6 deletion, and cluster 3 consisted of the TCF3::PBX1 cases and the near-triploid case, while the remaining BCP ALL cases were not in any cluster. Cases in cluster 1 displayed a considerable reduction in total number of TAD boundaries, lower TAD strength scores and increased TAD length when compared to clusters 2 and 3 . Agreeing with our observations in Article I, TAD boundary loss in cluster 1 was accompanied by significantly lower expression of CTCF, and, interestingly, gained TADs in this cluster showed a reduction in CTCF binding sites, indicating a possible CTCF-independent mechanism for new TAD formation in aneuploid samples.

Next, we merged Micro-C data from cases belonging to the same genetic subtype to generate high-resolution maps and perform loop calling at 5 kb . Analysis focused on leukemia-related genes evidenced that the high expression of FLT3 in HeH ALL was associated with increased chromatin interactions between the FLT3 promoter and an enhancer in PAN3 intron 8, in a CTCF-independent manner. We also observed lower expression of IKZF1 in cluster 1 correlating with reduced interactions of CTCF-dependent E-P loops. Additionally, histone modifier genes EP300, EZH2 and SETD1B showed loss of E-P loop strength and gene expression alterations in cluster 1. Transcription dysregulation associated with chromatin changes were also identified in cluster 2 for the known cancer-related genes $B R A F$, MYC and NOTCH1.

This study also included investigating the chromatin architecture of mitotic chromosomes, using the cohesion defects assay and chromosome morphology score combined with RNA-seq and Micro-C data. Consistent with Article II, HeH ALL cases displayed considerably higher levels of cohesion defects and one of the worst median CMS, while ETV6::RUNX1 and DUX4-rearranged cases consistently showed good mitotic chromosome structuring. Both cohesion defects and chromosome morphology significantly correlated with total number of TADs, as fewer TADs were associated with high PCG levels and poorer CMS. Moreover, we found that low expression of cohesion subunit SMC1A correlated with good chromosome morphology, while condensin subunits NCAPG2 and SMC4 low expression coincided with higher PCG levels.

As Micro-C data can be used for structural variant (SV) calling, we investigated the incidence of these events in 31 cases of our cohort with supporting data from WGS $(\mathrm{n}=19)$, SNP array $(\mathrm{n}=31)$ or $\mathrm{scWGS}(\mathrm{n}=8)$. We detected 116 SVs , which mostly were intrachromosomal rearrangements, and validated $86.2 \%$ of them with supporting data. Moreover, we identified the formation of 24 neo-TADs and 278 neoloops caused by somatic SVs. We showed that neoloops driven by PAX5 deletions increased the expression of truncated PAX5 transcripts in four ETV6::RUNX1 cases, and a $t(1 ; 19)$ derived neoloop potentially results in upregulation of UHRF1 by enhancer-hijacking in a HeH ALL case.

## Article IV

## Clonal origin and development of high hyperdiploidy in childhood acute lymphoblastic leukemia

Here, we explored the clonal origin and heterogeneity in HeH ALL by using scWGS of nine primary patient samples, bulk copy number data from WGS, WES and SNP array of 577 samples, and in silico modelling. Copy number analysis of single cells of nine HeH samples revealed very homogeneous genomes, where 5 out of 9 cases had the same chromosomal content in more than $99 \%$ of the cells, and 4 of the cases displaying 3 to 5 subclones with whole chromosome changes. Heterogeneity scores were calculated for each sample, showing that cases with higher scores also had higher subclonality, which was associated with high levels of cohesion defects for one sample but not for the others. Analysis of the phylogenetic trees showed early chromosome gains and late structural changes, suggestive of punctuated evolution. Moreover, many cases displayed copy number changes of the same chromosome in different clonal events, revealing strong selective pressure for gains of chromosome 21 and 17, and losses of chromosome 9.

We further explored selective pressures in primary HeH samples by analyzing bulk copy number data of 577 cases. A very strong selection for extra copies of chromosomes 21 (100\%), X (97\%), 14 (95\%), 6 ( $89 \%$ ), 18 ( $83 \%$ ), 4 ( $82 \%$ ), 17 $(78 \%)$ and $10(74 \%)$ were observed, followed by additional common gains of chromosomes 8 ( $38 \%$ ), 5 ( $23 \%$ ), 9 ( $19 \%$ ), 11 ( $14 \%$ ), 12 ( $14 \%$ ), and $22(11 \%)$. While the remaining chromosomes seem to have a neutral stance, chromosomes 13 and 20 may possibly be selected against as they were recurrently monosomic. UPIDs were seen in $36 \%$ of the cases in a ratio of $0-5 \%$ of UPID/all disomies, with the exception of UPID 9 which was present in a ratio of $17 \%$. In total, $72 \%$ of the cases in bulk analysis did not have detectable subclones, in line with the scWGS findings, and chromosomes 9 ( $8.7 \%$ ), X ( $5.1 \%$ ), $8(4.5 \%)$ and 21 (3.6\%) were the most commonly involved in subclonality. Agreeing with our observations, investigation of matched diagnostic and relapsed samples showed a positive selection for chromosome 8 and negative for chromosome 9. Additionally, we also noticed that cases with modal chromosome number $(\mathrm{MNC})$ 51-61 $(\mathrm{n}=545)$ and 62-67 $(\mathrm{n}=32)$ were presented with different ratios of trisomy/tetrasomy, which was further explored in our simulations.

In this study we have also explored the possible origins of high hyperdiploidy in BCP ALL by in silico modelling. We simulated 50000 cells over several generations
taking into consideration the chromosome gains with strong positive selection and the average UPID ratio ( $\sim 2.5 \%$ ) seen in primary HeH ALL, exploring five possible routes to aneuploidy: (1) diploid cell with sequential gains; (2) initial tetraploidy with sequential chromosomal losses; (3) diploid cell with a tripolar division; (4) initial tetraploid cell with tripolar division; (5) mitotic catastrophe by complete loss of sister chromatid cohesion. While simulations were stopped when UPID levels reached $2.5 \%$, routes (4) and (5) were removed from further testing due to inconsistently higher UPID frequencies (initial values of $18.2 \%$ and $9.9 \%$, respectively). Considering HeH cells with MNC 51-61, route (2) was also discarded as tetraploidy with sequential losses resulted in very few cells with such MNC, and we continued the investigations by comparing the pattern of trisomies and tetrasomies between primary samples and routes (1) and (3). Although the chromosome pattern of both remaining routes fit well with the patient data, the allelic ratio of $3: 1$ on tetrasomies had a much higher frequency in route (1) than in route (3) and patient data, supporting a diploid/tripolar division origin. Regarding HeH with MNC 62-67, both routes (2) and (3) agreed with patient data, and as such cases also displayed higher levels of subclonality, it is possible that HeH ALL with MNC 51-61 and MNC 62-67 have different mechanisms of development, but the great majority of HeH ALL cases likely originate from a tripolar division on an initial diploid cell as a punctuated evolution event, followed by low-level clonal evolution. In line with our hypothesis, frequency assessment of mutations that occurred before or after trisomy (BTRI or B/ATRI) in primary samples indicated that trisomies of chromosomes with strong positive selection harbor more B/ATRI mutations and thus were more recent than the ones with neutral or negative selection.

Lastly, we also observed that chromosome rearrangements and somatic mutations occur later than the bulk chromosomal gains. Most structural rearrangements were subclonal, including duplication of 1 q , deletion of 6 q and gains of 17 q , while isochromosome 7 q was usually present in the major clone. Between 10 and $40 \%$ of the primary samples harbored subclones with deletions in IKZF1, CDKN2A, PAX5, ETV6, CREBBP, and TCF3. Analysis of 338 driver mutations in 218 samples with either WES or WGS available also revealed that $44 \%$ of the events were subclonal, and mutational age estimation in trisomies and tetrasomies showed that $92 \%$ of driver mutations were B/ATRI, and only five - including a IKZF1 mutation - were B/ATRI events.

## Discussion

## What drives leukemogenesis in HeH ALL?

Taking into consideration that hyperdiploidy is an early event and a driver change in leukemogenesis, a long-lasting question that hovers around HeH ALL is what the effects of aneuploidy in this subtype are. A recurrent hypothesis is that genes located in the commonly gained chromosomes would be overly expressed, a phenomenon known as dosage effects. Indeed, studies have shown higher RNA expression of genes located in gained chromosomes (40, 132, 133). In Article I we addressed the impact of copy number alterations in HeH compared with ETV6::RUNXI ALL in a comprehensive way, combining RNA-seq, MS/MS, WGS, WES, SNP array and to some extent $\mathrm{Hi}-\mathrm{C}$.

Although RNA and protein levels are directly correlated, posttranslational regulation mechanisms may interfere in protein expression, and a given gene that is highly expressed in the transcriptome might not translate into high protein levels (134-136). This reinforces the importance of incorporating both transcriptome and proteome in cancer research. Here, we compared the mean RNA and protein expression according to chromosome copy number and showed a clear dosage effect, as expected. Gains of $\mathrm{X}, 14$ and 21 displayed stronger dosage effects, an interesting discovery since chromosome 21 is acquired in all HeH cases and chromosomes $X$ and 14 are the second and third most gained ones (62, 100, 101). Intriguingly, $16 \%$ of the genes and $25 \%$ of the inquired proteins showed instead a lower expression on gained chromosomes, meaning that not all genes are implicated by dosage effect. We further investigated the consequences of aneuploidy by inquiring trans effect, or the effect of chromosome gains in other genomic regions, and we found that hyperdiploidy has a wide-spread influence on the transcriptome and proteome.

The proteogenomic study in Article I also culminated in the discovery that CTCF and members of the cohesin complex display low expression in HeH ALL compared to ETV6::RUNX1 and normal pre-B cells, which was further explored in Articles II
and III. CTCF and cohesin are essential for topological regulation of gene expression and are recurrently involved in several cancer types ( $\mathbf{5}, \mathbf{1 1}, \mathbf{3 4}, \mathbf{1 1 5}, \mathbf{1 3 7}$ ). Disruption of TAD boundaries allow chromatin contacts that were otherwise insulated, leading to abnormal gene expression (11), and may cause oncogene activation and/or tumor-suppressor inactivation (11, 137). This led us to investigate in Article If the wide-spread transcription dysregulation seen in hyperdiploid cells were related to the low levels of these proteins. In fact, CTCF binding sites were considerably enriched in genes that were differentially expressed between HeH and ETV6::RUNXI ALL samples. Analysis of publicly available databases also showed that genes located within the same TAD were similarly expressed compared to genes from different TADs, an observation that held true for several cancer types, except for HeH ALL. Therefore, we performed $\mathrm{Hi}-\mathrm{C}$ in four HeH and two ETV6::RUNX1 ALL primary samples, which revealed clear abnormal chromatin architecture in HeH cells, even with the limited size of the cohort. Briefly, partial fusions of several TADs into one resulted in HeH samples displaying fewer number of TADs, although larger, compared to ETV6::RUNX1 samples and GM12878 publicly available data. Moreover, 131 of the apparently intact TADs - those where size and location did not change - had weakened or absent boundaries, strongly associated with CTCF-cohesin binding sites. This permissive state of topological boundaries is likely one of the phenomena underlying the genome-wide dysregulation of gene expression in HeH ALL and could be an important feature that distinguishes this subtype. A recurrent event in the context of chromatin architecture aberrations in cancer is oncogene activation by enhancer-hijacking, where the lack of specific TAD boundaries leads to a TAD fusion, and an enhancer that was once isolated from a given proto-oncogene can now activate it (137). In fact, our group has described in 2020 that deletions in 13q12.2, present in $\sim 2 \%$ of BCP ALL cases, led to a TAD fusion in a HeH case that allowed FLT3 upregulation through enhancer hijacking (138).

Based on such discoveries, Article III was designed to thoroughly investigate the 3D chromatin architecture of a larger cohort of primary patient samples of pediatric BCP ALL using Micro-C, including all main genetic subtypes. PCA of TAD boundaries showed that the three most representative BCP ALL subtypes of our cohort, HeH ( $\mathrm{n}=14$ ), ETV6::RUNX1 ( $\mathrm{n}=8$ ) and TCF3::PBX1 ( $\mathrm{n}=4$ ), cluster separately, in line with previous studies where PCA on T-ALL primary samples also pointed that different genetic subtypes display distinct 3D genomic signatures (139, 140). A very interesting discovery was that all aneuploid cases, except the neartriploid sample, clustered together, and this included HeH samples, one near-haploid
and one $B C R:: A B L 1$ case with hyperdiploidy. Since the chromosome gains of the near-haploid (27/54 chromosomes) and BA_1 (51 chromosomes) included chromosomes X, 14 and 21, the question remains of whether they cluster with HeH cases due to similar chromosome pattern or simply because they share similar chromosome number. Consistent with our findings in Article I, in Article III we observed overall weakened TAD boundaries, as well as fewer number of TADs, in the aneuploid group, and again affected TADs were strongly correlated to CTCF binding sites. Moreover, gained TADs in the aneuploid samples are not enriched for CTCF binding sites, suggestive of alternative mechanisms for TAD formation. It remains to be investigated whether these alternative mechanisms involve other recently described players in chromatin conformation, such as RNA pol II, YY1 or others (25).

Both cohesin and CTCF are frequently mutated in different cancer types, including in acute myeloid leukemia (141-143). Yet, such mutations are very rare in HeH ALL, and it remains to be answered whether other unidentified regulators/mechanisms are involved in the low expression of cohesin and CTCF in these samples or if the hyperdiploidy itself causes it. Studies on the effect of aneuploidy in chromosome territories have tried to clarify if the sole existence of extra material in the nucleus could culminate in genome-wide spatial changes (144, 145). One study in particular showed that a cell line in which the only acquired somatic event was trisomy 7 displayed several trans effects, such as global gene dysregulation, large A/B compartment shifts in chromosome 14 and loss of TAD boundaries in chromosome 4 (144). Single-chromosome gains also have an impact in the position of their own and other chromosome territories in the 3D setting of the nucleus $(\mathbf{1 4 4}, \mathbf{1 4 5})$. Hence, it would be interesting to investigate the impact of hyperdiploidy in chromosome territories in future studies, and perhaps this could bring us another piece of the puzzle that HeH is.

In Article I, we inquired whether DGE associated with chromosome gains per se in HeH ALL was targeting oncogenes or tumor-suppressor genes but found no correlation. Regarding the abnormal chromatin architecture seen in HeH cells, in Article III we observed events associated with well-known leukemia-related genes. The high-expression of FLT3, a hallmark of HeH ALL, was found to be caused by increased chromatin interactions between the gene and a strong upstream enhancer, a specific feature of HeH cases that is unrelated to somatic mutations -HeH cases with deletions in 13q12.2 display even higher FLT3 expression (138). Furthermore, IKZF1 low expression without the presence of deletions was also clarified by MicroC , as this gene shows decreased E-P interactions, suggesting weakening of
chromatin loops. Lastly, we observed the effects of structural events in chromatin architecture as deletions in PAX5 caused the formation of a neoloop that upregulates a truncated PAX5 transcript. Previous studies have shown that neoloop formation enables enhancer hijacking that affects TLX3, TAL2, HOXA and MYC in T-ALL (139, 140), and HSF4, MYC and CBL in AML (146). In sum, many transcriptional features in leukemia can be explained by topological events in the 3D genomic landscape, and in Article III we bring a comprehensive study of the 3D genome of nine genetic subtypes of childhood BCP ALL.

Considering the functional roles of the cohesin complex during mitosis, we have also investigated metaphase chromosome architecture in HeH ALL and other BCP ALL subtypes in Articles I-III. Firstly, we interrogated whether low expression of CTCF and cohesin affected the overall morphology of metaphase chromosomes in the same way as in interphase chromosome organization. Consistent with our hypothesis, we show in Article I that HeH ALL cases display poor chromosome morphology compared to ETV6::RUNX1 ALL. In Article III we observed that CMS varies between genetic subtypes, and HeH samples continue to display low scores, but most importantly we saw a correlation between number of TAD boundaries and metaphase chromosome morphology, where fewer TADs were associated with low CMS. In Article II we scrutinized the incidence and extent of sister chromatid cohesion defects in HeH compared to ETV6::RUNXI ALL, an assay that was repeated for the cases included in Articles III and IV. Although heterogeneous and not present in all cases, the incidence and severity of cohesion defects in HeH ALL is higher than in any other BCP ALL genetic subtype included in this thesis. In Article III we could also show a negative correlation between number of TAD boundaries and total PCG percentage in BCP ALL, in line with the known functions of the cohesin complex.

By combining RNA-seq data with the cytogenetic assays, we showed, in fact, a negative correlation between expression of the cohesin subunit RAD21 and percentage of PCG in Article II, as well as expression of the SMC1A subunit and chromosome morphology in Article III. Another study has put into context impaired condensin complex and mislocated aurora B in HeH ALL as causative of cohesion defects, although the cohesin complex was not investigated (141). Likewise, we show in Article II a correlation between low expression of condensin subunit NCAPG and cohesion defects in a larger cohort of primary HeH samples, and again in Article III for the NCAPG2 and SMC4 subunits.

Taken altogether, Articles I-III paint a chaotic scenery in chromosome organization, both at the interphase and metaphase level, of HeH ALL primary samples. The abnormal interphase chromatin architecture in HeH samples has an evident impact on dysregulation of gene expression. Concurrently, the combination of low levels of CTCF and cohesin (Article I), and impairment of condensin and aurora B (147) may explain the low proliferative rates described in HeH ALL, as sister chromatid cohesion defects and mitotic chromosome organization defects delay the mitotic process, and very likely culminate in mitotic slippage ( $\mathbf{6 2}, \mathbf{1 0 0}$, 147). We have yet to discover what causes low expression of CTCF and cohesin in HeH ALL, since no mutations are involved and the dosage effect seen in the subtype does not affect members of the cohesin complex, which are virtually all located in commonly gained chromosomes. As to how aneuploidy affects HeH ALL, the first clear answers are dosage effect and genome-wide trans effects in gene expression. Moreover, and most strikingly, chromosome gains seem to interfere in 3D genomic organization, as we observed that the whole aneuploid cluster in Article III displayed weakened and fewer TADs, even for a $B C R:: A B L 1$-positive case with hyperdiploidy, indicating that chromosome gains from different origins may have similar implications in TAD organization. In the future, functional studies of CTCF, cohesin and condensin knockdowns in aneuploid cell lines followed by Hi-C or Micro-C analysis could reinforce and help clarify the scenery seen in Articles I and III, as well as investigating primary samples of other aneuploid cancer types. Additionally, investigating the spatial organization of chromosome territories in HeH and other aneuploid BCP ALL subtypes could bring valuable information of the effect of extra chromosomes in leukemic cells.

## Stable or unstable? Origins and clonal evolution of HeH ALL

The non-random pattern of chromosome gains in HeH ALL has always puzzled researchers in the field. One of the continuously asked questions is whether aneuploidy in HeH cells is accompanied by chromosomal instability. As reviewed in the introduction of this thesis, CIN and aneuploidy are not synonyms, and aneuploid cells do not necessarily display CIN, as they can become stable shortly after arising (35-37). Cytogenetically, the karyotypes of HeH cells appear to be quite stable, very few subclones are seen, and subclonal variation is of relatively low complexity when compared with other cancer types (62). Studies using interphase FISH have reported that HeH samples display cell-to-cell copy number variation of its commonly gained chromosomes (148-150). Interphase FISH is, however, a problematic method of inquiring chromosome copy number heterogeneity depending on the control samples one uses and considering the higher incidence of
technical artifacts of cytogenetics compared to molecular biology techniques. Furthermore, one needs to account for the quality of the slide and the number of times it has been re-hybridized to target different chromosomes, since this increases unspecific signals from the fluorescent probes. As regards the choice of control samples, it is important to have the same baseline number of the inquired chromosomes between target and controls. That is because trisomies and tetrasomies require a higher cut-off level for the probes than disomies to avoid falsenegative signals. In Article II, we attempted to circumvent such issues by comparing specific chromosomes from HeH cases that had the same copy number.

Sister chromatid cohesion defects are a known cause of CIN. However, we found it puzzling that there was such a great variation of incidence and severity of PCGs in HeH ALL samples from our cohort in Article II. We then decided to perform interphase FISH to investigate whether cases with high levels of PCG would display increased chromosome copy number variation compared to cases with low or no PCGs. Indeed, we observed an increased variation in four out of the six investigated chromosomes associated with higher levels of cohesion defects, namely chromosomes 3, 6, 10 and 21. Moreover, knockdown of RAD21 in an ETV6::RUNX1-positive cell line resulted in cohesion defects, increased formation of multipolar mitoses, and increased copy number variation of chromosome 21. Based on our findings as detailed above and previous knowledge on how chromosomes are gained in HeH ALL (40, 62), cohesion defects are not likely to be the cause of aneuploidy in this subtype, although it might play a role in clonal evolution through increased chromosome heterogeneity. We continued our investigations in Article IV, where we performed scWGS in nine HeH samples and one normal bone marrow to analyze whole chromosome copy number variation from 257 to 348 individual cells per case. Here, we showed that HeH ALL displays a generally stable genome, as 5 out of 9 cases had the same chromosome number in more than $99 \%$ of cells, and the remaining of the cases displayed 3 to 5 subclones with numerical changes each. Combining these findings with bulk WGS screens, no correlation was seen between mutations in genes related to genomic instability and increased number of subclones. The HeH case with the second highest level of heterogeneity also displayed $85 \%$ of cohesion defects, however the other cases with several subclones displayed mild levels - below $21 \%$ of PCGs. Unfortunately, the cohort used for scWGS included only one case with high levels of cohesion defects. Complementary single-cell analysis of such cases would help clarify if there is a stronger relationship between clonal heterogeneity and cohesion defects in HeH ALL, or if cohesion defects are an independent phenotype with a distinct underlying mechanism, perhaps a reflection of abnormal chromatin structuring rather than a cause of missegregation.

As mentioned before, many causes of aneuploidy have been described in the literature. Defects in the SAC, sister chromatid cohesion defects, merotelic
attachments and multipolar mitosis are known pathways leading to chromosome copy number alterations $\mathbf{( 3 , 4 , 3 3 , 3 4 , 1 5 1 )}$. The routes that might lead to a stable hyperdiploid karyotype, however, are still a matter of discussion. Namely, four of these hypotheses are: (I) sequential chromosome gains in consecutive cell divisions due to sister chromatid nondisjunction; (II) an initial near-haploid cell that suffers duplication of its chromosomes; (III) an initial tetraploid cell with subsequent chromosome losses; or (IV) a punctuated event where a single abnormal mitosis leads to massive chromosome gains $(\mathbf{6 2}, \mathbf{1 5 2 - 1 5 4})$. Among the possible mechanisms suggested in literature, it is more likely that high hyperdiploid cells arise either by a tetraploid pathway (III) or by simultaneous gains (IV). Initial tetraploidization with subsequent chromosome losses would explain 2:2 allelic ratios in tetrasomies, and one third of the disomies resulted from loss of tetrasomy would be expected to display wUPID. Simultaneous chromosome gains in a single mitotic catastrophe would also explain the tetrasomy pattern in HeH and would result in no wUPID which agrees with the majority of the cases (40, 62, 154, 155). In Article IV, we analyzed the chromosome pattern and copy number changes in subclones of 577 HeH ALL samples, unveiling strong positive selection for chromosomes $\mathrm{X}, 4,6,10$, $14,17,18$ and 21 , weaker positive selection for chromosomes $5,8,11,12$ and 22 , and neutral or negative selection for chromosomes Y, $1,2,3,7,9,13,15,16,19$ and 20. We applied the acquired knowledge of positively selected chromosomes, as well as observed UPID rates $(\sim 2.5 \%)$, to an in silico model to simulate five possible scenarios that could give rise to high hyperdiploidy: (1) initial diploidy with sequential gains; (2) initial tetraploidy with sequential losses; (3) initial diploidy with a tripolar division; (4) initial tetraploidy with a tripolar division; (5) mitotic catastrophe due to complete loss of cohesion. Simulations were run starting with 50 000 cells, following through multiple generations, and stopped when the frequency of UPID reached $2.5 \%$. Then, comparison between simulations and copy number data from the 577 HeH samples showed that a tripolar division from an initial diploid cell best satisfied the required patterns to resemble HeH ALL primary samples. The tripolar origin was further validated by assessing the age of trisomies, based on whether somatic SNVs were present in one (before and non-duplicated or after trisomy origin, B/ATRI) or two (before trisomy, BTRI) homologues. Here, we observed that chromosome gains from the positive selection group were newer as they more often displayed B/ATRI mutations, reinforcing that the bulk of aneuploidies arises at once, followed by low-level clonal evolution with acquirement of strongly selected chromosome gains.

The genetic features of HeH ALL are well-fitted for a tumorigenesis model known as punctuated evolution (156). This model, which somewhat defies the perception of tumor evolution as a long and multi-stepped accumulation of genetic aberrations (29-31), consists of a short burst of massive genetic alterations that occur very early in tumorigenesis and already defines the main identity of the malignancy. Therefore,
cancer types with localized phenomenon on single chromosomes or aneuploid cancers both fit into the punctuated evolution model in cases where there is clonal stability and lack of intermediate states showing gradual evolution (156). Further exploring the idea of a single tripolar division from a diploid cell as an origin for high hyperdiploidy, it is noteworthy that tripolar mitoses are recurrent in tumors and can in fact continue to proliferate. A study on primary tumor samples showed that only a minority of tripolar mitoses result in three daughter cells, whereas a single multinucleated daughter cell occurred more often, and the majority of tripolar divisions resulted in two daughter cells - one binucleated and one mononucleated. Additionally, they observed that such binucleated daughter cells could undergo mitosis again with the formation of a single metaphase plate (157). Once more, it is necessary to make a distinction between a stable aneuploid cell and an aneuploid cell featuring CIN that shows signs of progressive clonal heterogeneity. In Article II, we performed immunofluorescence in RAD21-KD cells, and showed that 2.9\% of analyzed mitoses were tripolar ( $3.89 \%$ incidence of multipolarity in total). A similar percentage of multipolar mitoses was observed in another study that analyzed in vivo expanded primary hyperdiploid samples, where it was noted that there was no significant difference in frequency of such mitotic aberrations between hyperdiploid and non-hyperdiploid cells (147). This statement, however, considers observation of already established hyperdiploid leukemic cells, which have been shown by our group in Article IV and by previous cytogenetic studies $(\mathbf{6 2 , 1 0 5}, \mathbf{1 5 5})$ to be stable, with low proliferation rates and low heterogeneity. Rather than that, the diploid/tripolar model for the origin of HeH ALL implies that after the initial formation, the chromosomal gains in successive events will be minimal, and limited to chromosomes that are advantageous for the leukemic cell, hence agreeing with low frequency of tripolar divisions in diagnostic samples.

Ultimately, we have brought substantial evidence to support a punctuated evolution model for the origin of HeH ALL, where a tripolar division from a diploid cell generates the bulk pattern of chromosomal gains, followed by low-grade clonal evolution. Furthermore, we have extensively explored clonal heterogeneity in primary HeH ALL samples, combining cytogenetic and genomic techniques. As we tried to explain why we observe different levels of heterogeneity from case to case - although always towards lower complexity - it seems that the underlying reason has yet to be elucidated. It is likely that future studies involving single-cell genomics and transcriptomics could bring new insights regarding this, and perhaps prior screening for cohesion defects could help select a cohort with a higher chance of displaying copy number variation. Understanding what causes clonal heterogeneity in HeH ALL and the role of sister chromatid cohesion defects could pave the way for developing new targeted treatments, and this would help us understand whether this subtype requires further treatment stratification.

## Concluding remarks

The four articles included in this thesis have extensively explored the effects of chromosomal gains in HeH ALL, their chromosome organization features and their origins and clonal development. Our studies revealed that HeH samples display massive transcriptional dysregulation associated with dosage effects and trans effects from the chromosomal gains, as well as wide-spread abnormal chromatin architecture likely caused by low levels of CTCF and the cohesin complex. We further observed interphase and mitotic chromosome disorganization in this subtype, where HeH ALL displays fewer and weakened TAD boundaries, impacting on transcriptional regulation, and both poor mitotic chromosome morphology and sister chromatid cohesion defects associated with low expression of cohesin- and condensin-related genes. Additionally, we described the 3D chromatin landscape of the main genetic subtypes of pediatric BCP ALL, showing three different clusters with distinct 3D genomic signatures, revealing that cases with aneuploidy have similar topological characteristics, and shedding light to the involvement of chromatin architecture in dysregulation of leukemia-related genes, such as IKZF1, FLT3 and PAX5. We showed that high hyperdiploid cells are overall stable, harboring low-level clonal heterogeneity, but with relatively increased chromosome copy number variation in some cases, partially coinciding with the incidence of cohesion defects. Finally, our results point to a punctuated event as the origin of HeH ALL, with a diploid cell undergoing a tripolar division causing the bulk chromosomal gains, followed by low-grade clonal evolution.

As to future perspectives, we believe that the complex web connecting aneuploidy, aberrant chromatin organization at interphase/metaphase and levels of CTCF, cohesin and condensin require further investigation. More specifically, we would benefit from additional chromatin studies on a diverse cohort of aneuploid cancertypes to help us understand whether specific chromosome gains are responsible for the abnormal chromosome organization we have seen. It is also important to continue investigating CTCF, cohesin, condensin and other factors involved in chromatin folding in HeH ALL to have a clearer picture of their part in chromatin disorganization of this subtype, especially since different members of cohesin and condensin are correlating with our data in each study. Knockdown experiments of major players of chromatin organization in various aneuploid cell lines, followed by Micro-C, RNA-seq and cytogenetic studies, could help us to understand the role of these factors and whether we can reproduce the scenery seen in primary HeH samples. Prior screening of cohesion defects in primary patient samples followed by Micro-C and scWGS would also help clarify how strong is the association between sister chromatid cohesion defects and increased clonal heterogeneity in HeH ALL. To the best of our knowledge, chromosome territories have not been investigated in aneuploid BCP ALL samples yet, and exploring this level of genome
folding with matched 3D-FISH, Hi-C or Micro-C and transcriptomic data could bring more insight into the 3D genomic landscape of these leukemias. Likewise, applying methylome analysis to BCP ALL primary samples, such as assay for transposase accessible chromatin sequencing (ATAC-seq) for detecting open chromatin and whole genome bisulfite sequencing (WGBS) for detecting DNA methylation could bring additional in-depth information of epigenetic factors in this type of leukemia. Ultimately, this thesis took us one step further into understanding the molecular pathogenesis of the largest subtype of pediatric BCP ALL, paving the way for future investigations of the multiple layers of high hyperdiploidy in leukemia.

## Popular scientific summary

Leukemia is a blood cancer marked by proliferation of white blood cells, being classified into acute or chronic depending on how fast it develops and further divided based on the type of blood cells that are spreading. Thus, B-cell precursor (BCP) acute lymphoblastic leukemia (ALL) is a cancer of rapid progression and involves lymphocytes known as B-cells. Normally, B-cells undergo many changes to reach maturation and be ready to produce antibodies for our immune system, but in BCP ALL the B-cells are stuck at the beginning of their development, and they spread and renew themselves without ever acquiring their normal functions. BCP ALL is the most common cancer type in children and has an overall survival rate of more than $90 \%$. Nevertheless, it is very important to increase our knowledge of this type of leukemia to improve the outcome of those who relapse, and to reduce the overtreatment, when possible, since the intensity and toxicity of leukemia treatments can bring long-term collateral effects, both physically and mentally.

In our studies, we focus on the largest group of BCP ALL that accounts for 30\% of all pediatric cases, the high hyperdiploid $(\mathrm{HeH})$ subtype. While human cells normally have 46 chromosomes that contain all of our genetic material, or DNA, the HeH cells have between 51 and 67 chromosomes. It is still not completely understood how the leukemic cells end up gaining all this extra genetic material, or what the implications of having much more DNA than they should are. Therefore, the four studies included in this thesis explore the origins of the extra chromosomes, their consequences for regulation of genes in our DNA and how the chromosomes are organizing their genetic material.

In Articles I-III we found that the genetic material with extra copies in HeH ALL have higher expression than normal, and the extra chromosomes also affect the regulation of other parts of the DNA. We also showed that certain proteins that are responsible for how our DNA is compacted and organized have lower levels than usual in this leukemic subtype, namely CTCF and members of the cohesin protein complex. As a result, chromosomes from HeH ALL are very disorganized and fail to keep parts of the DNA separated from each other. This lack of proper separation also affects gene regulation, including genes that are important for leukemia
development, such as $F L T 3$ and $I K Z F 1$. We also discovered that the chromosomes in HeH cells are defective during cell division, or mitosis, being shorter than normal and having fuzzy-looking shape even compared to other types of leukemia, and often separating the two halves of the chromosomes before the right time (referred to as cohesion defects). The chromosome defects during mitosis also coincide with low levels of the cohesin complex, as well as the condensin complex - another group of proteins that organize mitotic chromosomes.

In Articles II and IV, we investigate how the extra chromosomes are gained and if the HeH cells usually keep the exact same chromosomes from cell to cell, or if there is a big variation in chromosome copy number. Many cancer types have unstable genetic material coinciding with gains of extra chromosomes, a phenomenon known as chromosomal instability, and this high rate of variation from cell to cell boosts cancer evolution and hinders treatment success. We observed that HeH cells with more severe cohesion defects in mitosis also had a higher variation in copy number of certain chromosomes from cell to cell. However, most HeH ALL cases do not have very severe cohesion defects, and by analyzing the DNA of each individual leukemic cell in nine patient samples we found that the chromosome number and content had little variation per cell. We showed that most HeH ALL cases have few subclones - leukemic cell populations with different DNA aberrations or chromosome number, and that certain chromosomes are gained more often in newer subclones than others, probably because they bring advantages to the cancer cells. Moreover, we used computer simulations to try and find what type of errors during mitosis could cause normal cells to acquire the same extra chromosomes we see in HeH ALL. By comparing the simulation results with patient data, we concluded that the great majority of HeH cells originate from a normal cell that tries to divide into three daughter cells instead of two - a tripolar mitosis.

In sum, this thesis contributes to a better understanding of the biology and genetics of one of the most common cancer types in children. We answered many questions about how HeH ALL arises and develops, and how their DNA organization and chromosome structures affect gene regulation. In the future, we would like to continue exploring how chromosomes are organized in this subtype, why so many chromosome organizing factors are at low levels and if there are other main players dysregulating the DNA in HeH ALL.

## Populärvetenskaplig sammanfattning

Leukemi är en blodcancer som kännetecknas av ökad tillväxt av vita blodkroppar. Den klassificeras som antingen akut eller kronisk beroende på hur snabbt den utvecklas och kan vidare delas upp baserat på vilken typ av blodceller som sprider sig. Således är B-cellprekursor (BCP) akut lymfatisk leukemi (ALL) en cancer med snabb progression och innefattar lymfocyter som kallas B-celler. Normalt genomgår B-celler många förändringar för att mogna och vara redo att producera antikroppar för vårt immunsystem, men i BCP ALL är B-cellerna fast i början av sin utveckling och de sprider sig och förnyar sig själva utan att någonsin få sina normala funktioner. BCP ALL är den vanligaste cancerformen hos barn och har en överlevnad på över $90 \%$. Trots detta är det mycket viktigt att öka vår kunskap om denna typ av leukemi för att förbättra utfallet för dem som får återfall, och för att minska överbehandlingen när det är möjligt, eftersom intensiteten och toxiciteten hos leukemibehandlingar kan ge långsiktiga biverkningar, både fysiskt och psykiskt.

I våra studier fokuserar vi på den största gruppen av BCP ALL som står för $30 \%$ av alla pediatriska fall, den hyperdiploida ( HeH ) subtypen. Medan mänskliga celler normalt har 46 kromosomer som innehåller allt vårt genetiska material, eller DNA, har HeH-cellerna mellan 51 och 67 kromosomer. Det är fortfarande inte helt klart hur leukemi cellerna fått allt detta extra genetiska material, eller vilka konsekvenserna är av att de har mycket mer DNA än de borde. Därför utforskar vi i de fyra studier som ingår i denna avhandling ursprunget till de extra kromosomerna, deras konsekvenser för regleringen av gener i vårt DNA och hur kromosomerna organiserar sitt genetiska material.

I Artikel I-III fann vi att det genetiska materialet med extra kopior i HeH ALL uttrycks högre än normalt, och de extra kromosomerna påverkar också regleringen av andra delar av DNA:t. Vi visade också att vissa proteiner som är ansvariga för hur vårt DNA är organiserat, nämligen CTCF och medlemmar av cohesinproteincomplexet, har lägre nivåer än vanligt i denna leukemiska subtyp. Som ett resultat är kromosomerna från HeH ALL mycket oorganiserade och misslyckas med att hålla delar av DNA:t separerade från varandra. Denna brist på korrekt separation påverkar också genregleringen, inklusive gener som är viktiga för
leukemiutveckling, såsom FLT3 och IKZF1. Vi upptäckte också att kromosomerna i HeH-celler är defekta under celldelning, eller mitos, eftersom de är kortare än normalt och ett mer diffust utseende jämfört med andra typer av leukemi, och ofta separerar de två halvorna av kromosomerna förtid (kallat sammanhållningsdefekter). Kromosomdefekter under mitosen är också associerade med låga nivåer av cohesin-komplexet, liksom kondensin-komplexet - en annan grupp proteiner som organiserar mitotiska kromosomer.

I Artikel II och IV undersöker vi hur de extra kromosomerna tillkommer och om HeH-celler vanligtvis behåller exakt samma kromosomer från cell till cell, eller om det finns variation i kopietalet av kromosomerna. Många cancerformer har instabilt genetiskt material tillsammans tillskott av extra kromosomer, en fenomen som kallas kromosominstabilitet, och denna stora variation från cell till cell ökar cancerevolutionen och hindrar behandlingsframgång. Vi observerade att HeH -celler med svårare sammanhållningsdefekter under mitosen också hade en större variation i kopietalet av vissa kromosomer mellan celler. De flesta HeH ALL-fall har emellertid inte mycket allvarliga sammanhållningsdefekter, och genom att analysera DNA från varje enskild leukemi cell i nio patientprover fann vi att kromosomantalet och innehållet uppvisade liten variation mellan celler. Vi visade att de flesta HeH ALL-fall har få subkloner - leukemiska cellpopulationer med olika DNA avvikelser eller kromosomantal, och att vissa kromosomer oftare tillkommer i nya subkloner än andra, förmodligen eftersom de ger fördelar till cancercellerna. Dessutom använde vi datorsimuleringar för att försöka hitta vilken typ av fel under mitos som kunde få normala celler att förvärva samma extra kromosomer som vi ser i HeH ALL. Genom att jämföra simuleringsresultaten med patientdata drog vi slutsatsen att den stora majoriteten av HeH -celler härstammar från en normal cell som försöker dela sig i tre dotterceller istället för två - en tripolär mitos.

Sammanfattningsvis bidrar denna avhandling till en bättre förståelse för biologin och genetiken hos en av de vanligaste cancerformerna hos barn. Vi besvarade många frågor om hur HeH ALL uppstår och utvecklas, och hur dess DNA-organisation och kromosomstruktur påverkar genregleringen. I framtiden skulle vi vilja fortsätta att utforska hur kromosomer organiseras i denna subtyp, varför så många kromosomorganiseringsfaktorer har låga nivåer och om det finns andra nyckelaktörer som dysreglerar DNA:t i HeH ALL.

## Resumo de divulgação científica

A leucemia é um câncer caracterizado pela proliferação de células brancas do sangue, sendo classificada como aguda ou crônica dependendo da rapidez com que se desenvolve e ainda dividida com base no tipo de células sanguíneas que estão se espalhando. Assim, a leucemia linfoblástica aguda (LLA) tipo B é um câncer de rápida progressão e envolve linfócitos conhecidos como células B. Normalmente, as células B passam por muitas mudanças para atingir a maturação e estar prontas para produzir anticorpos para o nosso sistema imunológico, mas na LLA tipo B , as células $B$ ficam presas no início de seu desenvolvimento, e se espalham e se renovam sem adquirir nunca suas funções normais. A LLA tipo B é o tipo mais comum de câncer em crianças e tem uma taxa de sobrevida global de mais de $90 \%$. No entanto, é muito importante aumentar nosso conhecimento sobre esse tipo de leucemia para melhorar o resultado daqueles onde o câncer volta e para reduzir o supertratamento quando possível, já que a intensidade e toxicidade dos tratamentos de leucemia podem trazer efeitos colaterais de longo prazo, tanto físicos quanto mentais.

Em nossos estudos, focamos no maior grupo de LLA tipo B que representa 30\% de todos os casos pediátricos, o subtipo hiperdiploide ( HeH ). Enquanto as células humanas normalmente têm 46 cromossomos que contêm todo o nosso material genético, ou DNA, as células HeH têm entre 51 e 67 cromossomos. Ainda não se compreende completamente como as células leucêmicas acabam adquirindo todo esse material genético extra, ou quais são as implicações de ter muito mais DNA do que deveriam. Portanto, os quatro estudos incluídos nesta tese exploram as origens dos cromossomos extras, suas consequências para a regulação dos genes em nosso DNA e como os cromossomos estão organizando seu material genético. Nos Artigos I-III, descobrimos que o material genético com cópias extras na LLA HeH tem uma expressão mais alta do que o normal, e os cromossomos extras também afetam a regulação de outras partes do DNA. Também mostramos que certas proteínas que são responsáveis por como o nosso DNA é organizado, CTCF e membros do complexo de proteínas coesina, têm níveis mais baixos do que o normal nesse subtipo de leucemia. Como resultado, os cromossomos da LLA HeH são muito
desorganizados e não conseguem manter partes do DNA separadas umas das outras. Essa falta de separação adequada também afeta a regulação de genes, incluindo genes que são importantes para o desenvolvimento da leucemia, como FLT3 e $I K Z F 1$. Descobrimos também que os cromossomos nas células HeH são defeituosos durante a divisão celular, ou mitose, sendo mais curtos do que o normal e tendo uma aparência borrada mesmo em comparação com outros tipos de leucemia, e frequentemente separando as duas metades dos cromossomos antes do momento certo (referido como defeitos de coesão). Os defeitos cromossômicos durante a mitose também coincidem com níveis baixos do complexo de coesina, bem como do complexo condensador - outro grupo de proteínas que organizam os cromossomos mitóticos. Nos Artigos II e IV, investigamos como os cromossomos extras são adquiridos e se as células HeH geralmente mantêm exatamente os mesmos cromossomos de célula para célula, ou se há uma grande variação no número de cópias cromossômicas. Muitos tipos de câncer têm material genético instável coincidindo com ganhos de cromossomos extras, um fenômeno conhecido como instabilidade cromossômica, e essa alta taxa de variação de célula para célula impulsiona a evolução do câncer e dificulta o sucesso do tratamento. Observamos que as células HeH com defeitos de coesão mais graves também tinham uma maior variação no número de cópias de certos cromossomos de célula para célula. No entanto, a maioria dos casos de LLA HeH não tem defeitos de coesão muito graves, e ao analisar o DNA de cada célula leucêmica individualmente em nove amostras de pacientes, descobrimos que o número e o conteúdo dos cromossomos tinham pouca variação por célula. Mostramos que a maioria dos casos de LLA HeH tem poucos subclones - populações de células leucêmicas com aberrações de DNA ou número de cromossomos diferentes, e que certos cromossomos são adquiridos com mais frequência em subclones mais recentes do que outros, provavelmente porque trazem vantagens para as células cancerosas. Além disso, usamos simulações computacionais para tentar encontrar que tipo de erros durante a mitose poderiam fazer com que células normais adquirissem os mesmos cromossomos extras que vemos na LLA HeH. Ao comparar os resultados da simulação com os dados dos pacientes, concluímos que a grande maioria das células HeH se originam de uma célula normal que tenta se dividir em três células filhas em vez de duas - uma mitose tripolar.

Concluindo, esta tese contribui para uma melhor compreensão da biologia e genética de um dos tipos mais comuns de câncer em crianças. Respondemos a muitas perguntas sobre como a LLA HeH surge e se desenvolve, e como a organização de seu DNA e estruturas cromossômicas afetam a regulação de genes. No futuro,
gostaríamos de continuar explorando como os cromossomos estão sendo organizados nesse subtipo, por que tantos fatores de organização cromossômica estão em baixos níveis e se existem outros principais agentes que desregulam o DNA na LLA HeH.

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And now, as we love games at C13, please enjoy this nerd-themed mini quiz.

1. Your fellow co-worker is about to defend their PhD thesis. Which of the following potions would you give them?
A) Pepperup potion
B) Edurus potion
C) Felix felicis
2. A wild Lucario appears right outside Stamstället. Which pokemon would you NOT use to defeat him?
A) The Bug/Poison type Beedrill
B) The Fire/Psychic type Armarouge
C) The Dragon/Ground type Garchomp
3. It is your Biobank week and 3 samples come at the same time. You wish you had the powers of:
A) Star-Lord
B) Quicksilver
C) Enchantress
4. Who could easily convince the BMC reception to give you access to every room in the building?
A) Obi-Wan Kenobi
B) Senator Amidala
C) $\mathrm{C}-3 \mathrm{PO}$

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## ARTICLE

# Proteogenomics and Hi-C reveal transcriptional dysregulation in high hyperdiploid childhood acute lymphoblastic leukemia 

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Hyperdiploidy, i.e. gain of whole chromosomes, is one of the most common genetic features of childhood acute lymphoblastic leukemia (ALL), but its pathogenetic impact is poorly understood. Here, we report a proteogenomic analysis on matched datasets from genomic profiling, RNA-sequencing, and mass spectrometry-based analysis of >8,000 genes and proteins as well as $\mathrm{Hi}-\mathrm{C}$ of primary patient samples from hyperdiploid and ETV6/RUNX1positive pediatric ALL. We show that CTCF and cohesin, which are master regulators of chromatin architecture, display low expression in hyperdiploid ALL. In line with this, a general genome-wide dysregulation of gene expression in relation to topologically associating domain (TAD) borders were seen in the hyperdiploid group. Furthermore, Hi - C of a limited number of hyperdiploid childhood ALL cases revealed that 2/4 cases displayed a clear loss of TAD boundary strength and $3 / 4$ showed reduced insulation at TAD borders, with putative leukemogenic effects.

[^0]Aneuploidy, i.e., changes in chromosome numbers, is one of the most common phenomena in cancer cells. In spite of the huge efforts that have gone into understanding the impact of somatic genetic events in cancer, the effects of aneuploidy in tumorigenesis remain poorly understood. In fact, it is even debated whether aneuploidy in itself may be a driver event or if it is a passenger event without consequences in tumor development ${ }^{1}$.

High hyperdiploid (51-67 chromosomes) pediatric B-cell precursor acute lymphoblastic leukemia (BCP ALL) is one of the most common malignancies in early childhood and is associated with a median age at diagnosis of 3-5 years, a low white blood cell count, and a favorable prognosis on contemporary treatment protocols ${ }^{2}$. Genetically, its defining feature is a nonrandom aneuploidy consisting of extra chromosomes, most commonly X, 4, 6, 10, 14, 17, 18, and 21. Approximately half of cases also harbor mutations in the RTK-RAS pathway, primarily KRAS, and $20 \%$ have mutations in histone modifiers such as $C R E B B P$, in addition to microdeletions of various genes involved in B-cell differentiation/cell cycle control ${ }^{3,4}$. However, these additional aberrations are seen only in a subset of the cases, are sometimes gained or lost at relapse, and, when occurring, are frequently subclonal, whereas the aneuploidy is uniformly present ${ }^{3,4}$. Furthermore, we and others have shown that the chromosomal gains in these cases are early and likely leukemiainitiating aberrations, often arising several years before overt disease ${ }^{3,5}$. Taken together, available data strongly indicate that the aneuploidy is the main driver event in this type of leukemia, but the underlying leukemogenic mechanism remains unclear.

Previous studies of the RNA expression pattern in high hyperdiploid ALL have revealed a general upregulation of genes on the gained chromosomes, hinting that dosage effects may occur ${ }^{3,6,7}$. However, no detailed analysis of how this may affect leukemogenesis has yet been published and it remains unknown how the chromosomal gains may cause the development of leukemia. Additionally, since genes are subject to posttranscriptional control, the RNA expression level of a gene may not be directly transferable to the protein level. To address this, we performed a proteogenomic analysis of a series of pediatric BCP-ALL, including high hyperdiploid and diploid/near-diploid ETV6/RUNX1-positive cases, aiming to determine the effects of aneuploidy. Besides demonstrating that the characteristic extra chromosomes have an impact on the transcriptome and proteome, we also present data suggesting that hyperdiploid leukemia cases harbor aberrant chromatin organization that causes genome-wide transcriptional dysregulation. Taken together, our data give insight into the leukemogenesis of this common and clinically important pediatric leukemia.

## Results

Proteogenomic analysis of childhood BCP ALL. This study comprised mass spectrometry (MS)-based analysis of the proteome, whole genome and/or whole exome sequencing (WGS/ WES) for somatic mutations and structural events, SNP array analysis for copy number assessment, and RNA-sequencing (RNA-seq) for RNA expression in childhood BCP ALL. In total, 48 high hyperdiploid and 41 ETV6/RUNX1-positive cases were investigated; the cohort analyzed with MS comprised eighteen high hyperdiploid and nine ETV6/RUNX1-positive pediatric ALL cases, as ascertained by chromosome banding, fluorescence in situ hybridization (FISH), SNP array analysis and reverse transcriptase-PCR for the fusion transcript (Fig. 1a and Supplementary Data 1 and 2).

MS data were generated via high-resolution isoelectric focusing liquid chromatography mass spectrometry (HiRIEF LC-MS/MS)
workflow together with isobaric labeling (TMT10) for relative quantification between tumors ${ }^{8}$. In total, 10,981 proteins originating from 10,138 genes were identified at $1 \%$ protein false discovery rate (FDR) based on 174,966 unique peptides (Fig. 1b, Supplementary Table 1 and Supplementary Data 3). For all quantitative proteome analyses, we used a gene symbol centric subset of 8480 genes that were quantified in each of the 27 tumors (Fig. 1b).

Genomic and transcriptomic variation was observed at the peptide level by searching HiRIEF LC-MS/MS spectra against a customized sequence database, which included both human RefSeq protein as well as somatic mutant and fusion sequences derived from WGS/WES and RNA-seq. Although many SNPs were seen in the protein dataset, none of the somatic mutations could be detected. The ETV6/RUNXI fusion could be identified at the protein level in all nine cases from this subgroup.

Proteome analyses give improved biological insight in cancer. For 8222 ( $97 \%$ ) of the 8480 proteins detected by HiRIEF LC-MS/ MS, the expression of the corresponding mRNA could be ascertained by rRNA-depleted RNA-seq (RiboZero RNA-seq) of the same samples (Supplementary Data 4 and 5). Expression levels were positively correlated for most (75\%) mRNA-protein pairs across the 27 samples, with $22 \%$ showing significant correlation (multiple-test adjusted $P \leq 0.05$ ) and a mean Spearman's correlation coefficient of 0.24 (Fig. 1c). This is similar to what has previously been reported in colorectal cancer ${ }^{9}$, but lower than in ovarian cancer and breast cancer ${ }^{10,11}$. When the correlation scores were ascertained for different KEGG pathways, scores were highest for specialized pathways, such as hematopoietic cell lineage and amino acid metabolism, and lowest for house-keeping functions, e.g., ribosomal and spliceosomal processes (Fig. 1d). This is in line with the previous studies ${ }^{9-11}$ and demonstrates that the level of expression of mRNA is not always directly translatable to the protein level. To further test the post-translational gene regulation effect on leukemia samples, we performed pairwise correlation of gene/protein abundance for all 8222 proteins. Similar to results previously obtained from the TCGA and CPTAC datasets ${ }^{12}$, the correlation score for pairs of proteins involved in the same protein complex displayed a degree of coregulation (mean Spearman's correlation coefficient $=0.19$ ) that was significantly higher than that observed for random pairs (mean Spearman's correlation coefficient $=0$ ) (Supplementary Fig. 1). A similar co-regulation effect could be seen at the transcript level (mean Spearman's correlation coefficient $=0.16$ ), but the correlation was significantly lower than at the protein level (two-tailed Mann-Whitney $U$-test $P=3.80 \mathrm{e}-20$ ).

To explore the details of this relatively low correlation between mRNA expression and protein abundance, we investigated several aspects of mRNA and protein regulation. A global comparison of stable and unstable mRNAs and their corresponding proteins ${ }^{13}$ revealed significantly higher correlation for genes with similar stability on both the mRNA and protein levels (Supplementary Fig. 2). Next, we investigated the potential impact of miRNA-targeting. Genes regulated by miRNAs ${ }^{14}$ displayed significantly lower mRNA and protein correlations, showing a role for post-transcriptional RNA regulation (Supplementary Fig. 2). We also observed that protein level regulation by the ubiquitin-proteasome pathway ${ }^{15}$ affected the correlations since genes with low mRNA-protein correlations were significantly more frequently targeted by the proteasome (Supplementary Fig. 2). Consistent with this result, an analysis of the protein degradation rate also showed that genes with low mRNA-protein correlations were enriched among rapidly degrading proteins ${ }^{16}$ (Supplementary Fig. 2). Interestingly, we observed that protein


Fig. 1 Proteogenomic study of childhood B-cell precursor acute lymphoblastic leukemia (ALL). a Genomic landscape of 27 childhood ALL included in the proteogenomic analysis. All cases were disomic for chromosomes 2, 19, and 20. b Numbers of proteins overlapping across the 3 TMT-sets. c Spearman's rank order correlation between mRNA and protein abundance. The correlation was positive for $77.6 \%$ mRNA-protein pairs in the whole cohort of cases with a mean Spearman's correlation coefficient of 0.24 . Approximately $23 \%$ mRNA-protein pairs showed significant correlation (multiple-test adjusted $P \leq$ 0.05). d When investigating different biological processes, mRNA and protein levels displayed the highest correlation for specialized pathways, such as hematopoietic cell lineage and amino acid metabolism, and lowest for house-keeping functions, e.g., ribosomal and spliceosomal processes
subcellular localization had an effect as cytosolic and proteins residing in the plasma membrane, endoplasmic reticulum and the Golgi (i.e., secretory proteins) exhibited increased mRNA-protein correlations whilst nuclear and mitochondrial proteins did not (Supplementary Fig 2). Finally, we also observed that mRNA and proteins that were differentially expressed between hyperdiploid and ETV6/RUNX1-positive leukemia had higher mRNA-protein correlations (Supplementary Fig. 2). This fits with the observation in Orre et al. ${ }^{17}$ that the secretory protein subset provides a better separation of cell lineages and cell types compared to nuclear proteins. Phenotypic genes thus seem to be more highly correlated on the mRNA-protein levels. Taken together, our analyses show that multiple factors contribute to lowering the correlation between mRNA and protein levels. Thus, proteome analyses are likely to give more biologically relevant data on
dysregulated pathways in cancer than RNA expression analyses alone.

Impact of copy number events. To study the impact of the extra chromosomes in high hyperdiploid ALL, we first compared the mean RNA and protein expression according to copy number in high hyperdiploid ALL. This clearly showed that the hyperdiploidy is associated with dosage effects, i.e., a generally increasing expression of genes and proteins with higher copy number (also termed cis effects; Fig. 2a). Notably, however, not all genes and proteins were affected in this way; approximately $16 \%(283 / 2,080)$ of genes and $25 \%(523 / 2,080)$ of proteins instead showed negative correlation with copy number. Thus, copy number gain does not always lead to increased expression, in particular at the protein


Fig. 2 Effects of copy number alterations on mRNA and protein abundance. a Dosage effects in 18 high hyperdiploid ALL at the RNA and protein levels. The effects were lower on the protein level than on RNA level, showing additional layers of control for protein expression. $\mathbf{b}$ Cohen's $d$ effect size analysis of gained chromosomes in high hyperdiploid vs. ETV6/RUNX1-positive leukemia. c cis and trans effects of copy number changes in 18 cases of hyperdiploid childhood B-cell precursor acute lymphoblastic leukemia. Correlations of copy number aberrations (CNA) ( $x$-axes) to RNA (top) and protein (bottom) expression levels ( $y$-axes) are shown. Note that a large fraction of the genome was not included in the analysis since there was no copy number variance, either because all cases had two copies or because all cases had three copies. Significant (multiple-test adjusted $P<0.05$ ) positive (red) and negative (blue) correlations between CNA and mRNAs/proteins are indicated. CNA cis effects appear as a red diagonal line, CNA trans effects as vertical stripes. The fraction (\%) of significant CNA trans effects (positive in red and negative in blue) for each CNA gene is shown below. The bottom panel shows the fraction (\%) of leukemias harboring CNA (copy number gain in red and copy number loss in blue). Chromosomes that were gained in more than 16 cases were not informative; their copy number is shown in gray
level, presumably because of feedback loops controlling expression and protein turnover. Cohen's d effect size analysis showed that gain of chromosomes $\mathrm{X}, 14$, and 21 was associated with stronger dosage effects compared with the other commonly gained chromosomes in both the RNA-seq and proteomics datasets, with a linear relationship between normalized copy number and effect size (Fig. 2b). Thus, our data clearly support previous studies showing a general-albeit not ubiquitousupregulation of genes in high hyperdiploid ALL ${ }^{3,6}$. Furthermore, we demonstrate that these dosage effects also are seen at the protein level, with proteins encoded on the gained chromosomes generally being more highly expressed.

To further investigate cis as well as trans (genes/proteins in other genomic regions) effects of copy number changes, we used a linear regression model to study the correlation between copy number and expression (Fig. 2c and Supplementary Fig. 3) ${ }^{18}$. In addition to the MS and RiboZero RNA-seq datasets, RNA expression from a previously published RNA-seq study was analyzed, comprising 83 cases (oligo(dT) RNA-seq; European Genome-phenome Archive accession number EGAD00001002112; Supplementary Data 1 and 6) ${ }^{19}$. In order to avoid outlier-driven results, only 2080 genes displaying copy number variation involving more than three cases were retained in the cis-effect analysis. Again, cis dosage effects were seen, involving 25\% (524/ 2080) of genes and $12 \%(245 / 2080)$ of proteins at a significance level of $P<0.05$ (Fig. 2c, Supplementary Fig. 3). Furthermore, trans effects on the whole transcriptome and proteome were seen for all informative regions. These were generally lower in the proteome data, in particular for the long arm of chromosome 1 and chromosomes 8,17 , and 21 , which displayed very few trans effects in the protein dataset. To further investigate the leukemogenic impact of individual chromosomal gains, we mapped known cancer driver genes to see whether they were associated with the chromosomal pattern of high hyperdiploid ALL. That is, whether oncogenes were more and tumor suppressor genes less commonly located on the frequently gained chromosomes. However, no such association was seen (Supplementary Fig. 3). Taken together, the analysis of copy number and gene/protein expression confirmed that the extra chromosomes in high hyperdiploid ALL have a large impact at RNA and protein levels in both cis and trans.

Protein expression differences between leukemic subtypes. Next, we focused on expression differences between high hyperdiploid and ETV6/RUNX1-positive ALL. To investigate whether proteomics could be used to distinguish between high hyperdiploid and ETV6/RUNX1-positive leukemia, hierarchical cluster and principal component analyses were performed. The two subtypes clustered separately in unsupervised analyses, both by RNA and protein expression, in 27 cases (Fig. 3a). In supervised analysis, 2423 genes and 1286 proteins were upregulated and 2222 genes and 1127 proteins were downregulated in high hyperdiploid cases compared with ETV6/RUNX1-positive cases (multiple-test adjusted $P \leq 0.05$ ) (Supplementary Data 4 and 5). Of these, 684 upregulated and 624 downregulated genes and proteins overlapped (Supplementary Data 4 and 5). Overall, there was a linear relationship between the $\log 2$ fold changes of RNA-seq and proteomics data (Spearman's correlation coefficient $=0.54, P<2.2 \mathrm{e}-16$ ) (Fig. 3b), with the correlation being stronger for gene/protein pairs with high fold changes.

Several of the top differentially expressed proteins have previously been reported to play a role in leukemogenesis or to be associated with ALL. These include, for example, CD44 and FLT3 (Supplementary Data 4 and Supplementary Fig. 4), which were highly expressed in high hyperdiploid cases. ETV6/RUNX1-
positive BCP-ALL has previously been reported to display a CD44 low-negative immunophenotype ${ }^{20}$, agreeing well with this protein being differentially expressed by proteomics. In regards to FLT3, the FLT3 gene harbors activating mutations in approximately $10-20 \%$ of high hyperdiploid ALL and has previously been reported to be highly expressed in high hyperdiploid ALL regardless of mutational status ${ }^{3,21}$. Here we show that this high expression is maintained at the protein level, suggesting that FLT3 may be involved in the leukemogenesis of high hyperdiploid childhood ALL also in the absence of mutations. A comparison with six sorted pro-B/pre-B samples-the normal cells considered to be closest to ALL blasts-in the oligo(dT) RNA-seq dataset confirmed that CD44 and FLT3 were highly expressed in the hyperdiploid leukemias (Supplementary Fig. 4). Among the top-downregulated proteins in high hyperdiploid cases were IGF2BP1, CLIC5, RAG1, and RAG2, which also showed low RNA expression compared with the normal pro-B/ pre-B dataset (Supplementary Data 4 and Supplementary Fig. 4). IGF2BP1 is recurrently involved in fusions with IGH@ in BCP ALL and has previously been reported to be highly expressed in ETV6/RUNX1-positive cases ${ }^{22,23}$. CLIC5 has been shown to be a target of ETV6 and loss of ETV6 leads to its upregulation, providing the cells with higher resistance to lysosome-mediated apoptosis ${ }^{24}$. As regards RAG1 and RAG2, these are key components of somatic $\mathrm{V}(\mathrm{D}) \mathrm{J}$ recombination and this process has previously been shown to be involved in ETV6/RUNX1mediated leukemogenesis ${ }^{25}$, agreeing well with the high expression seen in our cohort. Taken together, the top differentially expressed proteins obtained by MS agree well with previously reported RNA expression results, supporting the validity of our proteomics approach.

Gene set enrichment analysis (GSEA) was performed to identify dysregulated pathways in BCP-ALL. Pathways that were enriched in high hyperdiploid ALL in the protein analysis could be divided into six different categories: (1) translation and ribosomes, (2) innate immunity, (3) cell adhesion, (4) cytokines and activated signaling, (5) protein folding and proteolysis, and (6) the endosome (Fig. 3c and Supplementary Data 7). Pathways that were enriched in ETV6/RUNX1-positive cases comprised those related to: (1) chromatin organization, modification, and structure, (2) the G2/M checkpoint, and (3) mitochondria (Fig. 3c and Supplementary Data 8). Support for enrichment at the RNA level was seen for all these processes expect pathways related to mitochondria, both in the RiboZero and the oligo(dT) datasets (Supplementary Data 9-12). Taken together, the GSEA results suggest an upregulation of translation and protein metabolism, including proteolysis and the endosome, in high hyperdiploid ALL. This may be explained by the additional transcription from the extra chromosomes, which would be expected to result in a general increase in translation. Furthermore, aneuploidy, in particular hyperdiploidy, has been reported to be associated with a proteotoxic stress response related to increased strain on the protein folding pathways of the cell ${ }^{26}$, which could explain the enrichment for protein folding and proteolysis seen here. The relative downregulation of pathways related to chromatin organization, modifications and structure may be related to a higher proliferative capacity of ETV6/RUNX1-positive cases, but could also be associated with epigenetic events in high hyperdiploid ALL, in particular in light of the changes in chromatin organization that we found by high-resolution chromosome conformation capture ( $\mathrm{Hi}-\mathrm{C}$ ) in this subtype (see below). That the G2/M checkpoint is enriched in ETV6/RUNX1positive cases, on the other hand, agrees well with the previously reported importance of DNA recombination in such cases ${ }^{25}$.


Fig. 3 Clustering and enriched pathways in high hyperdiploid and ETV6/RUNX1-positive leukemia. a Principal component analyses of 27 B-cell precursor acute lymphoblastic leukemias showed that high hyperdiploid (red) and ETV6/RUNX1-positive (blue) cases clustered separately in unsupervised analyses by scaled RNA (left) and protein (right) abundance. b There was a linear relationship between the log2 fold changes of RNA-sequencing and proteomics data (Spearman's correlation coefficient $=0.54$ ) between the high hyperdiploid and ETV6/RUNX1-positive subtypes, demonstrating a high correlation between changes on the transcript and translation levels of an individual gene product. The correlation was stronger for gene/protein pairs with high fold changes. Significant changes found in both RNA-seq and LC-MS/MS are shown in red, inverse changes found in RNA-seq and LC-MS/MS in yellow significant changes found only in LC-MS/MS in green, and changes only found in RNA-seq in purple. c Gene set enrichment analysis of protein data highlighted sets of pathways that were significantly different between high hyperdiploid and ETV6/RUNX1-positive cases

Transcriptional dysregulation in high hyperdiploid ALL. We further found that CTCF, as well as several members of the cohesin complex, were significantly lower expressed at both the RNA and protein levels in our high hyperdiploid cases compared with ETV6/RUNX1-positive cases as well as compared with normal pro-B/pre-B cells (Fig. 4a, Supplementary Fig. 5). Analyses of the oligo(dT) RNA-seq dataset and two different publicly available array-based gene expression datasets (GEO accession numbers GSE13351 and GSE13425) confirmed that the expression of both CTCF and cohesin seems to be particularly low in high hyperdiploid ALL compared with other types of childhood ALL (Supplementary Fig. 5). We did not observe any differences in complex formation or correlation between the cohesin complex members between the high hyperdiploid and the ETV6/RUNX1positive cases (Supplementary Fig. 5), indicating that there was a general downregulation of gene/protein expression and not a disturbance of the complex formation. CTCF has recently been identified as a putative tumor suppressor gene in ALL and we have previously reported a CTCF/PARD6A fusion that presumably results in disruption of the normal function of CTCF in one case of high hyperdiploid ALL ${ }^{3,27}$. Besides being a transcription factor, CTCF binds to chromatin at interphase and, together with the cohesin complex, forms the basis for the formation of topologically associating domains (TADs); chromatin loops $<1 \mathrm{Mb}$ in size containing DNA sequences that interact more frequently with each other than with external sequences ${ }^{28}$. TADs are generally conserved between different tissues and their disruption leads to changes in gene expression when the insulating
function of the TAD boundaries is $\operatorname{lost}^{28}$. Thus, CTCF and cohesin are master regulators of transcription.

We hypothesized that this low expression of CTCF and cohesin could have genome-wide effects on the transcriptional regulation in high hyperdiploid ALL. To address this, we first investigated whether the differences in gene expression between high hyperdiploid and ETV6/RUNX1-positive ALL were associated with the number of CTCF binding sites in gene bodies and the flanking 5 kb , i.e., genes regulated by CTCF binding. We found that differentially expressed genes in both the oligo(dT) and RiboZero RNA-seq datasets were strongly enriched for more CTCF binding sites compared with genes that showed similar expression in the two ALL subtypes (chi-square test; $P=3.41$ e -05 and $P=1.549 \mathrm{e}-05$, respectively; Supplementary Fig. 6), in line with the previous experimental data from a mouse model with reduced CTCF expression ${ }^{29}$. Furthermore, genes with higher numbers of CTCF binding sites showed larger fold changes in both datasets (Supplementary Fig. 6). We also classified genes as anchor genes or background genes based on the distance of their transcription start sites to the closest CTCF/cohesin anchors, forming the basis for chromatin loops, according to published chromatin interaction analysis with paired-end tag sequencing (ChIA-PET) data ${ }^{30}$. We found that a significantly higher proportion of the genes that were differentially expressed between high hyperdiploid and ETV6/RUNX1-positive leukemias were anchor genes in both the oligo(dT) and the RiboZero RNA-seq datasets (hypergeometric test; $P=0.0139$ and $P=0.00513$, respectively; Supplementary Fig. 7). Furthermore, differentially


Fig. 4 Low CTCF/cohesin expression and transcriptional dysregulation in high hyperdiploid leukemia. a Boxplots of the expression of CTCF and members of the cohesin complex in proteomics (top) and RiboZero RNA-sequencing datasets (bottom). Low expression of CTCF/cohesin complex members was seen in the high hyperdiploid subgroup at both the RNA and protein levels. The center of the boxplot is the median and lower/upper hinges correspond to the first/third quartiles; whiskers are 1.5 times the interquartile range and data beyond this range are plotted as individual points. $\mathbf{b}$ Spearman's correlation coefficient between gene pairs as a function of distance across the oligo(dT) RNA-sequencing dataset for ETV6/RUNX1-positive cases (left; $n=39$ ) and high hyperdiploid ALL (right; $n=44$ ). The analysis showed that the expression of gene pairs in the same topologically associating domain (TAD; red) displayed higher correlation than those in different domains (blue) or randomly selected regions (gray) in ETV6/RUNX1-positive cases, whereas no difference was seen in high hyperdiploid ALL, suggesting that transcriptional dysregulation in hyperdiploid cases is related to TAD borders
expressed anchor genes showed significantly higher fold changes (Mann-Whitney $U$-test; $P=6.6 \mathrm{e}-6$ and $P=1.31 \mathrm{e}-4$, respectively; Supplementary Fig. 7), suggesting that a portion of differentially expressed genes between hyperdiploid and ETV6/RUNX1-positive cases were the result of changes in CTCF binding.
To further investigate how the low levels of CTCF and cohesin affected genome-wide transcription, we used publicly available data to classify gene pairs according to whether they should be divided by a TAD boundary or not, since the overall TAD structure is generally conserved in human tissues ${ }^{31}$. We then investigated whether their expression was correlated. First, we analyzed RNA-seq data from a large cohort of childhood ALL ( $n=201$ ) including all genetic subtypes ${ }^{19}$, from normal bone marrow $(n=20)^{19}$, from acute myeloid leukemia (TCGA-LAML, https://portal.gdc.cancer.gov/projects/TCGA-LAML; $n=151)^{32}$ and from papillary renal-cell carcinoma (TCGA-KIRP, https:// portal.gdc.cancer.gov/projects/TCGA-KIRP; $n=270)^{33}$. These datasets all clearly displayed higher correlation between the
expression of gene pairs within the same TAD compared with gene pairs separated by a TAD boundary (Supplementary Fig. 8), showing that the TAD structure used in the analysis corresponded well with actual transcriptional regulation and was in line with previous studies ${ }^{34}$. We then performed the same analysis in high hyperdiploid ( $n=44$ ) and ETV6/RUNX1-positive ( $n=39$ ) cases separately. Whereas the ETV6/RUNX1-positive leukemias showed a difference between intra- and inter-TAD gene pairs, similar to the other datasets investigated, no correlation with the expected TAD structure was observed in the high hyperdiploid samples (Fig. 4b). Analysis of two publicly available array-based gene expression datasets from childhood ALL (GEO accession numbers GSE13351 and GSE13425) confirmed that high hyperdiploid ALL displayed aberrant expression in relation to the expected TAD structure (Supplementary Fig. 8). Restricting the analysis to only the commonly trisomic or only the commonly disomic chromosomes did not change the result (Supplementary Fig. 8), suggesting that the phenomenon is not directly associated with the copy number of
individual chromosomes. Taken together, the analyses suggest that high hyperdiploid ALL exhibits an aberrant gene expression pattern associated with changes in DNA looping.

TAD boundaries in high hyperdiploid ALL. To investigate further the TAD organization in childhood ALL, we performed in situ Hi-C analysis on four high hyperdiploid and two ETV6/ RUNX1-positive cases (Supplementary Data 13). Raw sequencing data were processed using the HiCUP pipeline ${ }^{35}$, resulting in 230-320 million unique valid sequence tags per sample. An average of 3450 TADs (range 2965-3960) was identified per case by Domaincaller at 25 kb resolution with a mean size of $\sim 740 \mathrm{~kb}$ (range $645-845 \mathrm{~kb}$ ) (Supplementary Data 13). The average number of boundaries was 4230 (range 3853-4659) (Supplementary Data 13). The majority of TAD boundaries were expected to be bound by the insulator protein CTCF (86\%) and the cohesin subunit RAD21 ( $80 \%$ ), in line with previous reports (Supplementary Data 13 ) ${ }^{31}$. Comparing the TAD boundaries of our samples with the high resolution $\mathrm{Hi}-\mathrm{C}$ dataset from the human lymphoblastoid cell line GM12878 ${ }^{31}$ showed that approximately $70 \%$ of the TAD boundaries we found were also present in GM12878, indicating that the overall TAD structure was intact in the leukemia samples (Fig. 5, Supplementary Data 13).

We then investigated whether the low expression of CTCF/ cohesin affects higher-order segregation of active and inactive chromosome domains into $A$ and $B$ compartments. We determined the compartment types of the genome at 500 kb resolution in leukemia samples as well as GM12878 cell line using Juicer eigenvector ${ }^{36}$. Overall, most ( $>90 \%$ ) genomic regions were in the same compartment in the leukemia samples as in the GM12878 cell line and more than $98 \%$ of genomic regions were in the same compartment in high hyperdiploid ALL and ETV6/RUNX1-positive cases, in line with previous studies showing that depletion of CTCF does not lead to compartment switching ${ }^{37}$.

Comparing ETV6/RUNX1-positive and high hyperdiploid cases, the number of TAD boundaries were reduced and the average TAD structure length was increased by $21-120 \mathrm{~kb}$ in three of four high hyperdiploid ALL. The exception (case HeH_42) had an average TAD length of 645 kb (Supplementary Data 13). This increase in TAD lengths in the three hyperdiploid cases resulted from the partial fusion of multiple TADs into one, in line with the decrease in the number of TAD boundaries. In order to analyze changes in chromatin organization, we focused on recurrent changes in boundaries detected in the different subgroups of leukemia. One hundred thirty-one boundaries were weakened or absent in at least two high hyperdiploid samples whereas only 14 boundaries were absent in both ETV6/RUNX1-positive cases (Fig. 5 and Supplementary Data 14). Most of the corresponding boundaries overlapped CTCF-cohesin binding sites (127/131, $97 \%$ ), indicating that the loss of TAD boundaries was associated with loss of a functional CTCF/cohesin complex in high hyperdiploid samples (Supplementary Data 14). We then checked the expression of mRNA and proteins in the RiboZero RNA-seq and MS datasets. Of the 298 expressed mRNAs and 210 expressed proteins encoded within 1 Mb of the lost boundaries, significant (multiple-test adjusted $P \leq 0.05$ ) expression differences between high hyperdiploid and ETV6/RUNX1-positive ALL could be seen for 134 ( $45 \%$ ) and 65 (31\%), respectively (Supplementary Data 15). Of these differentially expressed genes/proteins, 98/134 (73\%) genes and $42 / 64(66 \%)$ proteins were downregulated in high hyperdiploid samples, which was more often than by chance (chisquare test, $P=4.6 \mathrm{e}-9$ for RNA-seq, and $P=0.0032$ for proteomics). This indicates that changes in chromatin
organization caused by CTCF/cohesin complex depletion tend to downregulate gene expression in high hyperdiploid cases.

Although the global chromosomal interaction pattern appeared largely unchanged between high hyperdiploid, ETV6/RUNX1positive cases and the cell line GM12878, closer inspection showed differences in the strength of internal interactions within TADs. To test whether the TAD interaction strength was affected, we used directionality index and insulation score analyses to calculate the ratio of interactions found within TADs versus those spanning a boundary ${ }^{38,39}$. We found a genome-wide change in directionality index as well as in insulation score between cases: two high hyperdiploid cases ( $\mathrm{HeH}-9$ and $\mathrm{HeH} \_10$ ) showed a clear loss of boundary strength based on directionality index analysis and three ( $\mathrm{HeH} \_9, \mathrm{HeH}_{-} 10$, and HeH _48) showed reduced insulation based on insulation score analysis compared with the GM12878 cell line (Fig. 6). Thus, whereas the position of TAD boundaries remained largely unchanged in high hyperdiploid ALL samples, their quality was affected by changes in local and distal interactions, with a fraction of TADs losing insulation strength. This suggests that at least a subset of high hyperdiploid ALL have significant loss of insulation at TAD borders, agreeing well with the observed transcriptional dysregulation in this subgroup.

Poor metaphase chromosome morphology in hyperdiploid ALL. To further explore the possibility of an aberrant chromatin organization in high hyperdiploid ALL, we next focused on the metaphase chromosomes. Metaphase chromosome morphology, corresponding to the number of bands obtained with banding techniques as well as the size and general appearance of the chromosomes, varies between different cells and tissues. CTCF is bound to chromatin throughout the cell cycle and it has been suggested that it also affects the metaphase chromosome architecture ${ }^{40}$. We, therefore, hypothesized that high hyperdiploid ALL may have aberrant chromosome morphology. In fact, a common opinion among hematological cytogeneticists is that this genetic subtype displays particularly poor chromosome morphology, although this has not, to the best of our knowledge, been properly investigated. To address this issue, we developed a scale from 1 to 3 ( 1 corresponding to poor and 3 to good morphology; Fig. 7) for scoring chromosome morphology (chromosome morphology score; CMS) in a consistent manner and applied it to 37 cases of high hyperdiploid ALL and 33 cases of ETV6/RUNX1positive ALL. Although the CMS varied between cells within the same case, there were clear differences in the mean values between cases (Supplementary Data 16). Furthermore, the investigation revealed a difference in mean CMS between the two genetic subtypes, with high hyperdiploid ALL displaying significantly lower CMS, corresponding to poorer chromosome morphology (Mann-Whitney one-sided test; $P=0.0075$; mean CMS 1.8 vs. 2.1; Fig. 7; Supplementary Data 16). Thus, metaphase chromosomes of high hyperdiploid ALL show signs of an aberrant chromatin organization, in line with our RNA-seq and Hi-C results.

## Discussion

We here report a full-scale proteogenomic analysis of childhood ALL, including the two largest subtypes of this disease that together constitutes more than half of cases. The investigation encompassed more than 8000 proteins and 12,000 RNAs in genetically well-characterized cases. To the best of our knowledge, only primary tumor samples from rhabdomyosarcoma, colon and rectal, prostate, and breast cancer have previously been subjected to proteogenomic analyses to this level ${ }^{9-11,41}$. Although many previous studies of childhood ALL have utilized RNA expression,


Fig. $5 \mathrm{Hi}-\mathrm{C}$ of high hyperdiploid and ETV6/RUNX1-positive cases. a Contact matrices from chromosome 3, selected because it is disomic in all cases and displays no structural aberrations. The whole chromosome at 250 kb resolution is shown to the left and the $161-172 \mathrm{Mb}$ region at 25 kb resolution to the right. At a resolution of 250 kb , the interaction profile is similar, showing that the general chromatin architecture is intact. However, at a resolution of 25 kb , it can clearly be seen that two of the high hyperdiploid cases ( HeH _9 and HeH_10) have lost some topologically associating domains. b A/B compartment profile of chromosome 3 in cell line GM12878 and the six leukemia samples at 500 kb resolution. The profiles were similar between the cell line and the leukemias
first with microarrays and more recently with RNA-seq ${ }^{3,6,7}$, the protein levels are expected to have a more direct impact on the phenotype and our proteome analysis thus provides an improved insight into leukemogenesis.

Previous studies of RNA expression in high hyperdiploid ALL have shown clear dosage effects ${ }^{3,6,7}$, i.e. a general upregulation of genes on the gained chromosomes, corresponding to cis effects. However, no data on the effect on protein expression or in-depth analyses of cis and trans effects in relation to the gained chromosomes have been published to date. Here, we show that the gained chromosomes in high hyperdiploid ALL are also associated with cis effects at the protein level, but that those effects are
weaker than at the RNA level. In addition, we also identified a general dysregulation of gene expression in relation to TAD boundaries in high hyperdiploid ALL. This corresponds to a likely disturbance in the insulation between regulatory elements and gene promoters that should be separated by a TAD boundary. Depleting CTCF experimentally has been associated with loss of insulation at TAD borders in a dose-dependent manner, whereas cohesin loss has been linked to lower insulation between TADs as well as depletion of $\mathrm{TADs}^{37,42,43}$. Thus, it is feasible that the relatively low expression of CTCF and cohesin that is seen in high hyperdiploid ALL could affect TAD border insulation and/or TAD structure. In line with this, our Hi-C analysis revealed that


Fig. 6 Weaker topologically associating domain (TAD) boundaries in high hyperdiploid samples. a Median standardized directionality index profiles around TAD boundaries identified in high hyperdiploid cases (red), ETV6/ RUNX1-positive cases (blue) and the GM12878 cell line (black). Two high hyperdiploid cases (HeH_9 and HeH_10) showed markedly decreased boundary strength, indicating permissive TAD boundaries. b Median insulation score around the TAD boundaries identified in high hyperdiploid cases (red), ETV6/RUNX1-positive cases (blue) and the GM12878 cell line (black). Three high hyperdiploid cases (HeH_9, HeH_10, and HeH_48) showed decreased insulation signal amplitude suggesting weaker insulation between TADs compared to the remaining samples
three of four investigated high hyperdiploid samples displayed weaker TAD boundaries than the remaining leukemias and control cell lines, although the relatively small number of samples investigated prevents definite conclusions. Additionally, a higher number of TAD boundaries were recurrently lost in high hyperdiploid cases compared with the ETV6/RUNX1-positive cases and the cell lines. Furthermore, we found that high hyperdiploid ALL display an aberrant chromosome metaphase morphology, also suggesting an aberrant chromatin architecture. The underlying cause of the low CTCF and cohesin expression in high hyperdiploid ALL is currently unknown but mutations are unlikely to be the general cause; although these do occur, the
a

b


Fig. 7 Metaphase chromosome morphology in hyperdiploid leukemia. High hyperdiploid childhood acute lymphoblastic leukemia samples displayed varying metaphase chromosome morphology, but the majority of cases had poor morphology. a Example of metaphase with score 1-poor morphology (case $\mathrm{HeH}_{2} 33$ ). b Example of metaphase with score 2-fair morphology (case HeH_48). c Example of metaphase with score 3-good morphology (case HeH_48)
frequency is relatively low ${ }^{3}$. CTCF is encoded on chromosome 16, which is rarely gained ${ }^{2}$, whereas the core members of the cohesin complex are all encoded on commonly gained chromosomes ( 8 q 24 for RAD21, 10q25 for SMC3, Xp11 for SMC1A and Xq25 for STAG2); thus, the specific aneuploidy in high hyperdiploid ALL may cause relatively low expression of CTCF but not of cohesin.
Taken together, we show that the chromosomal gains in high hyperdiploid ALL are associated with genome-wide effects on
transcription. Furthermore, we show genome-wide transcriptional dysregulation with putative leukemogenic effects in relation to TAD borders in the hyperdiploid subtype suggestive of changes in chromatin architecture; such changes could also be seen by HiC in a subset of cases. Whether aberrant chromatin architecture is a common phenomenon in aneuploid tumors remains an open question.

## Methods

Patients. The study comprised a total of 48 high hyperdiploid and 41 ETV6/RUNX1-positive pediatric BCP-ALL cases that had been treated at Skåne University Hospital, Lund, Sweden, selected based on samples being available from diagnosis (Supplementary Data 1). The cohort included 52 boys and 37 girls, with a median age at diagnosis of 4 years (range $0-16$ ) and a median white blood cell count of $7.8 \times 10^{9} / 1$ (range $0.9-164$ ). All cases had been tested for BCR/ABL1, ETV6/RUNX1, PBX1/TCF3 and KMT2A (previously MLL) rearrangements by reverse-transcriptase PCR, fluorescence in situ hybridization, or Southern blot as part of the clinical analyses and were found to be negative for these fusion genes, with the exception of the ETV6/RUNX1 fusion in that subgroup. Informed consent was obtained according to the Declaration of Helsinki and the study was approved by the Ethics Committee of Lund University.

DNA and RNA extraction. Details for samples subjected to oligo(dT)-based RNAseq have been published elsewhere ${ }^{19}$. For samples subjected to mass spectrometry analysis, DNA, total RNA and proteins were extracted from bone marrow or peripheral blood samples obtained at diagnosis and stored in TRIzol (ThermoFisher Scientific, Waltham, MA) at $-80^{\circ} \mathrm{C}$ for $4-17$ years. After addition of chloroform, RNA and DNA were precipitated according to the manufacturer's instructions. The remaining fractions containing proteins were stored at $-80^{\circ} \mathrm{C}$.

Sample preparation for mass spectrometry. The stored TRIzol fractions were thawed and loaded into Slide-A-lyzer cassettes (ThermoFisher Scientific, $3.5-\mathrm{kDa}$ cut-off, cat no 87722) and dialyzed according to the manufacturer's instructions against an aqueous solution containing $0.25 \%$ SDS and 25 mM Hepes pH 7.6 overnight at $4^{\circ} \mathrm{C}$ with two changes of the dialysis buffer. The dialyzed samples were digested by a modified FASP-protocol ${ }^{5}$. Protein concentrations were estimated by gel staining and approximately $250 \mu \mathrm{~g}$ of each sample was mixed with 1 mM DTT , 8 M urea, 25 mM HEPES, pH 7.6 and transferred to a $10-\mathrm{kDa}$ cut-off centrifugation filtering unit (Pall, Nanosep ${ }^{\oplus}$, Merck, Darmstadt, Germany), and centrifuged at $14,000 \times g$ for 15 min . Proteins were alkylated by 50 mM iodoacetamide (IAA) in 8 M urea, 25 mM HEPES for 10 min . The proteins were then centrifuged at $14,000 \times$ $g$ for 15 min followed by two more additions and centrifugations with 8 M urea, 25 mM HEPES. Proteins were digested at $37^{\circ} \mathrm{C}$ with gentle shaking overnight by addition of Lys-C (enzyme:protein $=1: 50$, Wako Pure Chemical Industries, Ltd.) in 500 mM Urea, 50 mM HEPES pH 7.6 followed by an additional overnight digestion with trypsin (enzyme:protein $=1: 50$, ThermoFisher Scientific) in 50 mM HEPES, pH 7.6. The filter units were centrifuged at $14,000 \times g$ for 15 min followed by another centrifugation with MilliQ water and the flow-through was collected. Peptides were cleaned up by a modified sp3-protocol ${ }^{44}$. Briefly, carboxylatemodified paramagnetic beads (ThermoFisher Scientific; CAT No. 09-981-121 and ThermoFisher Scientific; CAT No. 09-981-123) were mixed 1:1 and washed with MilliQ water. $10 \mu \mathrm{l}$ of the bead-mixture was added to each peptide sample. Acetonitrile was added so that the final concentration was $>95 \%$ and beads were incubated at room temperature for 8 minutes. Next, beads were placed on a magnetic rack, the supernatant discarded and the beads washed twice with $180 \mu \mathrm{l}$ of acetonitrile. Beads were re-suspended in $100 \mu \mathrm{l}$ of MilliQ water and sonicated to release the peptides, supernatants were collected and stored at $-20^{\circ} \mathrm{C}$. Peptide concentration was determined by the Bio-Rad DCC assay and $30 \mu \mathrm{~g}$ of peptides from each digested sample was labeled with TMT 10-plex reagent according to the manufacturer's protocol (ThermoFisher Scientific). A small portion of unlabeled peptides were pooled from all samples to generate an internal standard that was labeled with TMT-channel 131 and included in all sets. Labeled samples were pooled, cleaned by strata-X-C-cartridges (Phenomenex, Torrance, CA) and dried in a Speed-Vac.

Peptide level sample fractionation through HiRIEF. The TMT labeled peptides, $300 \mu$ g, were separated by immobilized pH gradient - isoelectric focusing (IPG-IEF) on $\mathrm{pH} 3-10$ strips using the HiRIEF method ${ }^{45}$. Peptides were extracted from the strips by a prototype liquid handling robot, supplied by GE Healthcare BioSciences AB. A plastic device with 72 wells was put onto each strip and $50 \mu \mathrm{l}$ of MilliQ water was added to each well. After 30 minutes incubation, the liquid was transferred to a 96 well plate and the extraction was repeated two more times with $35 \%$ acetonitrile (ACN) and $35 \% \mathrm{ACN}, 0.1 \%$ formic acid in MilliQ water, respectively. The extracted peptides were dried in Speed-Vac and dissolved in 3\% ACN, $0.1 \%$ formic acid.

Mass spectrometry based quantitative proteomics. Extracted peptide fractions were separated using an Ultimate 3000 RSLCnano system coupled to a Q Exactive (ThermoFisher Scientific). Samples were trapped on an Acclaim PepMap nanotrap column (C18, $3 \mu \mathrm{~m}, 100 \AA, 75 \mu \mathrm{~m} \times 20 \mathrm{~mm}$, ThermoFisher Scientific), and separated on an Acclaim PepMap RSLC column (C18, $2 \mu \mathrm{~m}, 100 \AA, 75 \mu \mathrm{~m} \times 50 \mathrm{~cm}$, ThermoFisher Scientific). Peptides were separated using a gradient of mobile phase A ( $5 \% \mathrm{DMSO}, 0.1 \% \mathrm{FA}$ ) and B ( $90 \% \mathrm{ACN}, 5 \% \mathrm{DMSO}, 0.1 \% \mathrm{FA}$ ), ranging from 6 to $37 \%$ B in 60 min (depending on IPG-IEF fraction complexity) with a flow of $0.25 \mu \mathrm{l} / \mathrm{min}$. The Q Exactive was operated in a data-dependent manner, selecting top 10 precursors for fragmentation by HCD. The survey scan was performed at 70,000 resolution from $400-1600 \mathrm{~m} / \mathrm{z}$, with a max injection time of 100 ms and target of $1 \times 10^{6}$ ions. For generation of HCD fragmentation spectra, a max ion injection time of 140 ms and AGC of $1 \times 10^{5}$ were used before fragmentation at $30 \%$ normalized collision energy, 35,000 resolution. Precursors were isolated with a width of $2 \mathrm{~m} / \mathrm{z}$ and put on the exclusion list for 70 s . Single and unassigned charge states were rejected from precursor selection.

Peptide and protein identification. Orbitrap raw MS/MS files were converted to mzML format using msConvert from the ProteoWizard tool suite ${ }^{45}$. Spectra were then searched using MSGF $+(\text { v10072 })^{46}$ and Percolator $(\mathrm{v} 2.08)^{47}$, where search results from eight subsequent fraction were grouped for Percolator target/decoy analysis. All searches were done against the human protein subset of Ensembl 75 in the Galaxy platform. MSGF + settings included precursor mass tolerance of 10 ppm , fully-tryptic peptides, maximum peptide length of 50 amino acids and a maximum charge of 6 . Fixed modifications were TMT-10plex on lysines and peptide N -termini, and carbamidomethylation on cysteine residues, a variable modification was used for oxidation on methionine residues. Quantification of TMT-10plex reporter ions was done using OpenMS project's IsobaricAnalyzer (v2.0) ${ }^{48}$. Peptide-spectrum matches (PSMs) found at $1 \%$ false discovery rate (FDR) were used to infer gene identities. Protein quantification by TMT 10-plex reporter ions was calculated using TMT PSM ratios to the entire sample set (all 10 TMTchannels) and normalized to the sample median. The median PSM TMT reporter ratio from peptides unique to a gene symbol was used for quantification. Protein false discovery rates were calculated using the picked-FDR method using gene symbols as protein groups and limited to $1 \% \mathrm{FDR}^{49}$.

DNA sequencing analyses. WGS results for cases $\mathrm{HeH} \_2, \mathrm{HeH} \_3, \mathrm{HeH}_{-} 12$, HeH_13, $\mathrm{HeH} \_17, \mathrm{HeH} \_22, \mathrm{HeH} \_24, \mathrm{HeH} \_25, \mathrm{HeH} \_27, \mathrm{HeH} \_32$, $\mathrm{HeH} \_35$, HeH 38 , and $\mathrm{HeH} \_43$ and WES results for cases $\mathrm{HeH} \_1, \mathrm{HeH} \_4, \mathrm{HeH} \_5, \mathrm{HeH} \_7$, HeH 8, HeH_16, HeH_19, HeH_26, HeH_34, HeH_37, and HeH_41 have been previously published ${ }^{3}$. Briefly, for WGS, matched diagnostic and remission bone marrow or peripheral blood samples were sequenced to $\sim 100 \mathrm{x}$ coverage on the Complete Genomics platform. Somatic events were identified using the Complete Genomics Cancer Sequencing v2.0 pipeline with CGA tools. For WES, libraries were constructed using the SureSelectXT2 Human All Exon V4 kit (Agilent Technologies, Santa Clara, CA) from matched diagnostic and remission bone marrow or peripheral blood samples and paired-end sequencing were done to $\sim 120 \mathrm{x}$ coverage on an Illumina HiSeq2000. Somatic mutations were detected with MuTect ${ }^{50}$. WES for cases $\mathrm{HeH} \_6$, $\mathrm{HeH} \_9-\mathrm{HeH} \_11, \mathrm{HeH} \_14, \mathrm{HeH} \_15, \mathrm{HeH} \_18$, and ETV6/RUNX1_1-ETV6/RUNX1_9 were done by Nextera Rapid Capture Expanded Exome Kit (Illumina, San Diego, CA, USA), with ~110x coverage on an Illumina NextSeq 500 . Paired remission samples were available from cases $\mathrm{HeH} \_6$, HeH_10, HeH15, ETV6/RUNX1_1-ETV6/RUNX1_5, and ETV6/RUNX7_1ETV6/RUNX1_9. Pair-end sequence reads were aligned to the human_glk_v37 by Burrows-Wheeler Aligner (BWA) ${ }^{51}$. Duplicate reads were marked with Picard and Indel realignment was performed with GATK ${ }^{52}$. Somatic mutations were identified using MuTect ${ }^{50}$ and MuSE ${ }^{53}$ whereas somatic indels were identified by manta ${ }^{54}$ and strelka ${ }^{55}$ with default settings. Mutations that passed the internal filters of the variation caller were further filtered by a minimum depth of 10 reads. For tumor samples without matched normal (HeH_9, HeH_11, HeH_14, HeH_18 and ETV6/ RUNX1_6), variations were identified by GATK UnifiedGenotyper and annotation parameters QD (variant confidence/quality by depth) $<2.0$, MQ (RMS mapping quality) <40.0, FS (Fisher strand) 60.0, HaploTypeScore >13.0, MQRankSum < -12.5 and ReadPosRankSum $<-8.0$ were used to filter low quality variations. High-quality variants were further filtered by 1000 Genomes (20110521 release), ESP6500, ExAC, CG46 (popfreq_max_20150413) and 170 million variants (kaviar_20150923) provided by ANNOVAR ${ }^{56}$ to remove potential SNP sites Functional annotation was performed by ANNOVAR.

SNP array analyses. SNP array analysis was done on DNA extracted from diagnostic bone marrow or peripheral blood samples on the HumanlM-Duo, Human-Omnil-Quad, Human-Omni5-4v (Illumina, San Diego, CA), or CytoScan HD platforms (Applied Biosystems, Thermo Fisher); data have been published previously ${ }^{57}$.

RNA-sequencing. Details on the oligo(dT) RNA-seq dataset have been previously published ${ }^{19}$. Briefly, cDNA sequencing libraries were constructed from poly-Aselected RNA using the Truseq RNA library preparation kit v2 (Illumina, San Diego, CA) and sequenced on an Illumina HiScan SQ or an Illumina NextSeq 500.

For the RiboZero RNA-seq, RNA from cases HeH_1-HeH_18 and ETV6 RUNX1_1-ETV6/RUNX1_9 were constructed using the Human Ribo-Zero rRNA Removal Kit (Illumina, San Diego, CA) and sequenced on an Illumina NextSeq 500.

Expression analyses. RNA sequencing data were processed using the TCGA mRNA-seq pipeline (https://docs.gdc.cancer.gov/Data/Bioinformatics_Pipelines/ Expression_mRNA_Pipeline/\#mrna-analysis-pipeline). Briefly, sequencing reads were aligned to the human GRCh38 genome assembly using STAR ${ }^{58}$ and read counts for each gene were obtained by HTSeq-count ${ }^{59}$.

Genes with count-per-million (CPM) value greater than 1 were defined as expressed genes and only genes expressed in more than $80 \%$ of samples in at least one sample group were used for further analyses. For differential expression analysis, batch effects were adjusted by using RUVg function in RUVSeq ${ }^{60}$ and differentially expressed genes were identified by using edgeR ${ }^{61}$. Benjamini-Hochberg adjusted (BH-adjusted) $P \leq 0.05$ were used as cutoff. In the oligo(dT) dataset, six samples representing sorted pro-B (CD34+CD38+CD19+CD10+) or pre-B (CD34$\mathrm{CD} 38+\mathrm{CD19}+\mathrm{CD} 20-\mathrm{CD10+}$ ) cells were included and used to compare leukemic samples to the closest normal cell.

For the proteomics dataset, absolute intensity values of the PSMs were converted to ratios based on the pool reference and log2 transformed. Spectra mapping to unique gene symbols were retained and aggregated to proteins using the median value of the PSM ratios. Proteins identified in all sets were used for subsequent analysis. To remove the batch effects of proteomics data, iterative RUV4 algorithm was used ${ }^{62}$. In brief, we initialized the search with the median normalized dataset to detect the proteins with BH-adjusted $P$ greater than 0.9 as the first controls by using limma ${ }^{63}$. In each of the 10 iterations, we applied the RUV4 algorithm on the un-normalized data to obtain the residuals and calculate ab initio the control proteins as those with differential abundance of BH-adjusted $P$ greater than 0.9 . These proteins were used as control proteins in the next iteration. Control proteins identified in the last iteration constituted the empirical controls which were uncorrelated to the tumor category. Protein differential expression analysis was performed by limma and BH -adjusted $P \leq 0.05$ was applied as cutoff for identifying differentially expressed proteins.

Two gene expression datasets obtained from NCBI Gene Expression Omnibus (accession numbers GSE13351 and GSE13425) were analyzed. The expression data were analyzed using Transcriptome Analysis Console (Affymetrix, Santa Clara, CA, USA) with default settings.

Correlation between mRNA and protein variation. To compare mRNA and protein variations across samples, we focused on 8222 genes/proteins that were detected in both the Ribozero RNA-seq dataset and the proteomics dataset. We first calculated the Spearman's correlation coefficient between RNA-seq FPKM values and RUV4-normalized values from the proteomics dataset across samples ( $n=27$ ) and $P$-values corresponding to the coefficients were computed and adjusted by Benjamini-Hochberg procedure. Significant calls were made based on BH-adjusted $P \leq 0.05$. Functional enrichment analysis was performed by GSEA-Pre-ranked algorithm ${ }^{64}$ and Spearman's correlation coefficient was used as the ranking variable. Pairwise correlation analysis of protein pairs, which are present within the same complex of known protein complexes acquired from the CORUM database ${ }^{65}$, were performed by using Spearman correlation's coefficient and the same analysis was performed on the RiboZero RNA-seq dataset. For the mRNAprotein stability analysis mRNA and protein half-lives from mouse fibroblast cell lines were extracted from Schwanhäusser et al. ${ }^{13}$ and analyzed as per the original manuscript and Zhang et al. ${ }^{9}$, i.e., stable (unstable) mRNAs and proteins were categorized according to their rank in the top (bottom) one third of half-lives, respectively. For micro-RNA targeting analysis miRNA-mRNA interactome data was downloaded from Helwak et al. ${ }^{14}$. For the analysis of the impact of ubiquitination and proteasomal degradation time-series ubiquitination data from HCT116 and 293T human cell lines upon bortezomib treatment was used ${ }^{15}$. We chose the 8hour point as a proxy for steady-state and divided significantly/non-significantly ubiquitinated proteins according to an absolute log2 fold change greater/smaller than 1 . We also investigated the impact of protein degradation profiles, namely exponential (ED) and non-exponential (NED) decay, using mouse fibroblast cell data from a click-chemistry assisted pulsed SILAC study ${ }^{16}$. Information on protein subcellular localization was downloaded from a MS-based study on global subcellular localization ${ }^{17}$ and used to subset our dataset. For the analysis of the impact of differential expression/abundance on mRNA-protein correlations transcripts/ proteins were divided to significant/non-significant based on BH adjusted $P$-value $<0.05$ and $\log 2$ fold changes higher (lower) than the $90 \%$ ( $10 \%$ ) percentile. To avoid correlations being driven by tumor subtype differences (Simpson's paradox), partial correlations were estimated after regressing the data on tumor subtype and calculating Spearman correlations on the residuals. For the above analyses, we used overlapped gene symbols between datasets. Two-group and multi-group comparisons were assessed with two-sided Wilcoxon rank sum test and Kruskal-Wallis test, respectively.

Analysis of cis- and trans-effects. Matched copy number aberrations (CNA) based on SNP-array analysis, WES and/or WGS, proteomics and RNA-seq
measurements of 18 high hyperdiploid samples were used to study the impact of CNAs on mRNA and protein expression. In order to avoid outlier-driven results, only genes displaying CNAs involving more than 3 cases in each comparison group were retained (CNA genes, $n=2080$ ). To analyze genome-wide cis effects of high hyperdiploid ALL samples, Spearman's correlation coefficient between genes/proteins abundance and copy number of 2080 informative CNA genes was calculated respectively. To analyze genome-wide trans effects, the correlation between CNA genes and all 8222 mRNA and proteins detected in both RNA-seq and proteomics of 18 high hyperdiploid samples were determined using the MatrixeQTL R package ${ }^{18}$. Subsequently, $P$-values corresponding to the coefficient were calculated and significant CNA-mRNA and CNA-protein correlations were identified using BH -adjusted $P$-value 0.05 as cutoff.

To assess the impact of copy number aberrations on the hyperdiploid vs. ETV6/RUNX1-positive ALL differential expression, a normalized copy number per chromosome across the samples was calculated according to the formula:


Cohen's d effect size was calculated per chromosome at the mRNA and protein level and linearly regressed on the normalized copy number. We denoted significantly affected chromosomes as those with effect size $>0.3$.

To estimate the differential expression of known cancer driver genes ${ }^{66}$ on the mRNA and protein level based on edgeR and limma, respectively, fold changes were overlaid on the ALL copy number landscape and gene symbols with BH adjusted $P$-values $\leq 0.05$ and fold change greater (lower) than the 90th (10th) percentile were displayed.

Gene set enrichment analysis. Gene set enrichment analysis ${ }^{64}$ was done using the GSEA-pre-ranked algorithm with lists of all expressed genes ( $n=12,313$ for Ribozero and $n=13,951$ for oligo(dT), respectively) and all expressed proteins ( $n=8480$ ), by using predictive $\log$ fold changes between high hyperdiploid ALL and ETV6/RUNX1-positive cases generated by edgeR (RiboZero and oligo(dT) RNA-seq) and log-fold changes values generated by limma (LC-MS/MS) as the ranking variable, respectively. We performed the analysis using the GSEA standalone software with default settings. Family-wise error rate (FWER) $P<0.05$ was considered significant.

CTCF binding site and ChIA-PET data analysis. CTCF binding sites analysis was done according to Aitken et al. ${ }^{29}$. We downloaded the positions of CTCF binding sites from the ENCODE database (http://hgdownload.cse.ucsc.edu/goldenpath/ hg19/encodeDCC/wgEncodeAwgTfbsUniform/ wgEncodeAwgTfbsBroadGm12878CtcfUniPk.narrowPeak.gz) and the number of CTCF binding sites in each gene (plus 5 kb on either side) were obtained by using BEDTools (https://bedtools.readthedocs.io/en/latest/) command intersect. The proportion difference between the differentially expressed genes group and the remaining genes group was tested with the chi-square test and the difference between fold changes according to number of CTCF binding sites was tested by Mann-Whitney $U$-test. ChIA-PET data for CTCF and RAD21 were downloaded from the NCBI GEO database under accession numbers GSM1872886 and GSM1436265, respectively. To get high-confidence chromatin interactions, ChIAPET interactions with low PET-count (less than ten reads coverage) were removed BEDTools was used to find the overlapping interactions between CTCF and RAD21 ChIA-PET datasets and only interactions detected in both datasets were used. BEDTools command closest was used to determine the distance between the transcription start sites of expressed genes and CTCF/cohesin anchors. Genes located within 5 kb of a CTCF/cohesin anchor were defined as anchor genes. Statistical differences in the proportion of differentially expressed genes between the anchor genes group and the background group were tested by hypergeometric test and the differences between fold change values were tested with the Mann-Whitney $U$-test.

Gene pair correlation analysis. Gene pair correlation analysis was done according to Flavahan et al. ${ }^{34}$. Briefly, TADs of the IMR90 and GM12878 cell lines were downloaded from published Hi-C data ${ }^{31}$ (Gene Expression Omnibus accession number GSE63525) and genes were assigned to the inner-most domain in which the transcription start site of the canonical transcript fell within. Genes were assigned to the same domain if they were assigned to the same domain in both GM12878 and IMR90 datasets. Ten thousand randomly generated domains were obtained by using BEDTools command random with 1 Mb as interval size. Spearman's correlation coefficient for all relevant gene pairs within the same TAD, different TADs and randomly generated domains were calculated and the correlation plot was smoothed by locally weighted scatterplot smoothing with weighted linear least squares (LOESS).

Hi-C library preparation and sequencing. $\mathrm{Hi}-\mathrm{C}$ was done on cases $\mathrm{HeH} \_9, \mathrm{HeH}$ 10, $\mathrm{HeH} \_42$, $\mathrm{HeH} \_48$, ETV6/RUNX1_6, and ETV6/RUNX1_41, selected on the
basis of sample availability. Cell pellets approximately 5 mm in size containing mononuclear bone marrow or peripheral blood cells obtained at leukemia diagnosis were resuspended in 10 ml room temperature $1 \times$ PBS. The cells were fixed by the addition of $37 \%$ formaldehyde to a final concentration of $2 \%$ and gentle mixing on a rocker for 10 min at room temperature. The reaction was quenched by the addition of 1.5 ml cold glycine ( 0.125 M ). Following incubation for 5 min at room temperature and 15 min on ice, the cells were pelleted by centrifugation at $400 \times g$ for 10 min at $4^{\circ} \mathrm{C}$. The pellet was resuspended in 1 ml cold $1 \times$ PBS by pipetting and made up to a final volume of 10 ml with cold $1 \times$ PBS. Finally, the cells were pelleted by centrifugation at $400 \times g$ for 10 min at $4^{\circ} \mathrm{C}$, and the pellet snap-frozen and stored at $-80^{\circ} \mathrm{C}$ until further analysis. In nucleus $\mathrm{Hi}-\mathrm{C}$ on the crosslinked mononuclear cells was performed as outlined in Nagano et al. ${ }^{67}$. Each sample was split into two and processed separately to provide a technical replicate. One lane of 150 base pair paired-end sequencing was performed on the Illumina HiSeq 4000 instrument per replicate (12 lanes in all).

Hi-C data analysis. The sequences from the Hi-C libraries were mapped to reference human_glk_v37 using HICUP with default settings ${ }^{35}$. Redundant reads and short-range Hi-C artifacts were removed from all downstream analyses. Filtered read pairs were then aggregated into 25,50 , and 100 kb genomic bins to generate Hi-C contact matrices. Low-coverage bins were filtered by using maximum allowed median absolute deviation (MAD-max) and low-coverage bins with MAD-max values higher than 2 were removed. Reads mapped to the same bin or adjacent bins were also removed. For the GM12878 cell line datasets, we downloaded.hic data from the NCBI GEO database (accession number GSE63525, GM12878_insitu_primary+replicate_combined_30.hic.gz) and converted.hic for mat into 25,50 , and 100 kb contact matrices by using the dump option of Juicertools ${ }^{36}$. The same filtering strategy was applied to the GM12878 cell line dataset. The filtered contact matrices were then normalized using the chromosomeadjusted iterative correction procedure ( caICB ) to eliminate copy number bias ${ }^{68}$.

TAD and boundaries calling. The normalized 25 kb contact matrices of six leukemia cases and GM12878 cell line were used to predict TAD structures by DomainCaller ${ }^{39}$, as this showed the best agreement with manual annotation in a previous study ${ }^{69}$. To find the optimal threshold for TAD calling, the window size parameter of DomainCaller was varied from 250 kb to 2 Mb and finally 500 kb window size was used, which showed about $80 \%$ of detected boundaries co-aligned with the previously detected boundaries of the GM12878 cell line ${ }^{31}$ (accession number GSE63525, GM12878_primary+replicate_Arrowhead_domainlist.txt.gz) with $\pm 100 \mathrm{~kb}$ precision. Standardized genome-wide directionality index value ( z score value) was used for TAD analysis. InsulationScore package was also used to identify TAD boundaries ${ }^{38}$. For insulation boundaries analysis, insulation square was set to 250 kb and insulation delta span was set to 125 kb . Insulation score was calculated for each chromosome and then normalized by the genome-wide median.

TAD analysis. When comparing TAD boundaries between high hyperdiploid ALL and ETV6/RUNX1-positive cases, boundaries detected in different samples within $\pm 100 \mathrm{~kb}$ were called overlapped boundaries while the recurrent boundaries found only in one subgroup of leukemia samples were defined as subgroup-specific boundaries. To investigate loss of TAD boundaries in high hyperdiploid ALL, the multiinter command in BEDTools software was used to identify the overlapped boundaries and subgroup-specific boundaries. To further correlate the presence of boundaries in the different subgroups of leukemia, the subgroup-specific boundaries were manually traced. Briefly, balanced-corrected Hi-C matrices were plotted using Juicebox ${ }^{36}$ and subgroup-specific boundaries were stratified into three categories, (i) boundaries showing sharp visual contrast between within and across TAD interaction frequencies were classified as strong boundaries, (ii) boundaries showing little visual contrast were classified as weak boundaries and (iii) boundaries that totally disappeared in one of subgroup of leukemia cases were classified as lost boundaries. To detect CTCF and RAD21 binding sites occupancy over the subgroup-specific boundaries, peak files were downloaded from the UCSC database (http://hgdownload.cse.ucsc.edu/goldenPath/hg19/encodeDCC/ wgEncodeAwgTfbsUniform/) and the intersectBed command in BEDTools software was used to identify all CTCF/RAD21 peaks located within a $\pm 50 \mathrm{~kb}$ window around the boundary.

Chromosome morphology analysis. Bone marrow or peripheral blood prepara tions and G-banding was performed according to standard methods from cells obtained at diagnosis and stored in fixative (methanol:acetic acid; $3: 1$ ) at $-20^{\circ} \mathrm{C}$. The slides were analyzed using an Eclipse 80i microscope (Nikon, Tokyo, Japan) equipped with a progressive scan camera (JAI, Copenhagen, Denmark) and a $\times 100$ oil immersion Plan Apo VC lens (Nikon). Metaphases were captured, edited and karyotyped with the CytoVision software (Leica Biosystems, Wetzlar, Germany). Each metaphase was scored from 1-3 according to chromosome morphology, as judged by the level of chromosome condensation, the band resolution, overall chromosome shape and clearness, and how easily the chromosome pairs could be identified.

The criteria used for scoring were: 1-poor chromosome morphology, where no substantial banding pattern could be observed, chromosomes were very condensed, chromosomes presented a fuzzy appearance, i.e., chromosome shape was poor, and homolog pairs were difficult to identify; 2-fair morphology, where band level was at 200-300, chromosomes were less constricted and presented a sharp appearance which made it easier to karyotype; and 3-good morphology, where the band level was at least 350-400, chromosomes were elongated and presented an ideal appearance for cytogenetic analysis (Fig. 7). The person doing the chromosome morphology investigation was blinded to the results from $\mathrm{Hi}-\mathrm{C}$ analysis.

Reporting Summary. Further information on experimental design is available in the Nature Research Reporting Summary linked to this article.

## Data availability

The mass spectrometry proteomics data have been deposited to the ProteomeXchange ${ }^{70}$ Consortium (http://proteomecentral.proteomexchange.org) with the dataset identifier PXD010175. RNA-seq data have been deposited to the European Genome-phenome Archive (EGA) under the accession code EGAS00001003079. The remaining data will be available for academic research on somatic variants only by contacting the authors. Publicly available data used in this study can be found as deposited in the following datasets: Oligo(dT) RNA-seq data for ALL patients, accession number
EGAD00001002112. Expression data from ALL patients, accession numbers GSE13351 and GSE13425. RNA-seq dataset for AML, accession number TCGA-LAML. RNA-seq dataset for papillary renal cell carcinoma, accession number TCGA-KIRP. Hi-C dataset for GM12878 cell line and IMR90 cell line, accession number GSE63525. GM12878 CTCF ChIA-PET dataset, accession number GSM1872886. GM12878 RAD21 ChIA-PET dataset, accession number GSM1436265.

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## Author contributions

M.Y., M.V., J.L. and K.P. conceived the study. M.Y. analyzed RNA-seq, proteome, WES, and Hi-C data. M.V. and R.J. performed the MS experiments. M.V. and I.S analyzed proteome and RNA-seq data. L.H.M.-C. performed metaphase chromosome experiments. A.C. provided clinical data and input. T.F. supervised RNA-seq. H.L. performed RNA-seq. D.T.O. supervised Hi-C experiments. L.O. performed SNP array analyses. N.R and E.L.W. performed RNA-seq and WES. L.H. performed Hi-C experiments and analyzed data. J.L. and K.P analyzed data and supervised the study. M.Y., M.V., J.L. and K.P. wrote the manuscript with input from all authors.

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## SUPPLEMENTARY INFORMATION FOR

Proteogenomics and Hi-C reveal transcriptional dysregulation in high hyperdiploid childhood acute lymphoblastic leukemia

Yang et al.
a
Protein Complex Correlation

b

> Protein



Supplementary Fig. 1. Analysis of protein complex formation a. Distribution of Spearman's correlations between protein-pairs known to form or partake in the same protein complex (CORUM) (top) compared to the distribution of Spearman's correlations of random protein pairs in the proteomics data. b. Example of relative levels and relative expression of members of the MCM complex in the proteomics and the RiboZero RNA-sequencing dataset, respectively.


Supplementary Fig. 2. mRNA-protein correlation analysis. a. mRNA-protein correlation in relation to protein and mRNA stability, showing higher correlation for genes with similar stability on both the mRNA and protein levels. b. Transcripts reported to be targeted by miRNAs were compared to non-targeted transcripts, showing higher correlations for non-targeted transcripts. c. Association of mRNA-protein correlation to ubiquitination. mRNA-protein correlations are categorized into low (black) and high (grey) ubiquitination based on time series data following proteasomal inhibition by bortezomib. Proteins targeted by the proteasome displayed lower correlations. d. Comparison of proteins with an exponential (ED) and non-exponential degradation profile (NED), showing enrichment of genes with low mRNA-protein correlations among rapidly degrading proteins. e. Impact of protein subcellular localization on mRNAprotein correlations, showing higher correlations for secretory and cytosolic proteins. f. Comparison of mRNA-protein correlation distribution for differentially expressed and non-differentially expressed proteins and mRNAs. Genes that were differentially expressed between hyperdiploid and ETV6/RUNX1-positive leukemia displayed higher mRNA-protein correlations. For all panels, number of observations, medians, first and third quartiles, and whiskers extending to 1.5 times the interquartile range are displayed. Nonparametric Wilcoxon rank sum test (b-d, f ) or Kruskal-Wallis test ( $\mathrm{a}, \mathrm{e}$ ) was used to calculate $P$-values.


Supplementary Fig. 3. Analysis of the impact of copy number on expression in childhood acute lymphoblastic leukemia (ALL). a. Correlations of copy number aberration (CNA) (x-axes) to RNA expression levels (y-axes) based on oligo(dT) RNAseq from high hyperdiploid cases are shown. Significant (multiple-test adjusted $P<0.05$ ) positive (red) and negative (blue) correlations between CNA and mRNAs are indicated. CNA cis effects appear as a red diagonal line, CNA trans effects as vertical stripes. The fraction (\%) of significant CNA trans effects (positive in red and negative in blue) for each CNA gene is shown. The bottom panel show the fraction (\%) of leukemias harboring CNA (copy number gain in red and copy number loss in blue). b. Location and expression of oncogenes and tumor suppressor genes in relation to chromosomal gains in high hyperdiploid vs. ETV $6 / R U N X 1$-positive ALL. No association was seen between oncogenes and copy number gains or tumor suppressor genes and non-gained chromosomes.


Supplementary Fig. 4. Examples of expression data from differentially expressed genes between high hyperdiploid and ETV6/RUNX1-positive acute lymphoblastic leukemia. The center of the boxplot is the median and lower/upper hinges correspond to the first/third quartiles; whiskers are 1.5 times the interquartile range and data beyond this range are plotted as individual points. Non-parametric Wilcoxon rank sum test was used to calculate $P$-values.
a

b

High hyperdiploid


## ETV6/RUNX1-positive



Supplementary Fig. 5. CTCF and members of the cohesin complex in high hyperdiploid and ETV6/RUNX1-positive leukemia. a. mRNA expression in acute lymphoblastic leukemia datasets. The center of the boxplot is the median and lower/upper hinges correspond to the first/third quartiles; whiskers are 1.5 times the interquartile range and data beyond this range are plotted as individual points. Non-parametric Wilcoxon rank sum test was used to calculate $P$-values. b. Cohesin complex members correlation. Green lines represent a Spearman's correlation coefficient of $>0.5$ and grey lines are a correlation $>0$ but $<0.5$.


Supplementary Fig. 6. Gene expression changes and number of CTCF binding sites in high hyperdiploid leukemia. a. Genes that were differentially expressed between high hyperdiploid and ETV6/RUNXI-positive leukemias were strongly enriched for more CTCF binding sites in both the RiboZero (chi-squared test, $P=1.55 \mathrm{e}-5$ ) and oligo(dT) (chi-squared test, $P=3.41 \mathrm{e}-5$ ) RNA-seq datasets. $\mathbf{b}$. Genes with higher numbers of CTCF binding sites in their bodies or flanking 5 kb showed significantly larger fold changes in both datasets. Two-sided Mann-Whitney U test was used to calculate $P$ values.


Supplementary Fig.7. Gene expression changes and CTCF/cohesin-mediated chromatin structures in high hyperdiploid leukemia. a. Fraction of anchor genes ( $\mathrm{n}=1,825$ and $\mathrm{n}=1,910$, respectively) and background genes ( $\mathrm{n}=10,403$ and $\mathrm{n}=10,597$, respectively) that were differentially expressed between high hyperdiploid and ETV6/RUNX1-positive leukemia. A significantly higher proportion of anchor genes were differentially expressed in both the RiboZero (hypergeometric test, $P=0.00513$ ) and oligo(dT) (hypergeometric test, $P=0.0139$ ) RNA-seq datasets. $\mathbf{b}$. Anchor genes ( $\mathrm{n}=1,825$ and $\mathrm{n}=1,910$, respectively) showed significantly higher absolute fold changes than background genes ( $\mathrm{n}=10,403$ and $\mathrm{n}=10,597$, respectively) in both the RiboZero (two-sided Mann-Whitney U test, $P=6.59 \mathrm{e}-6$ ) and oligo(dT) (two-sided Mann-Whitney U test, $P=$ $1.31 \mathrm{e}-4)$ RNA-seq datasets.


Supplementary Fig. 8. Spearman's correlation score between gene pairs as a function of distance for genes in the same or different topologically associating domains (TADs), showing higher correlation between the expression of gene pairs within the same TAD compared with gene pairs separated by a TAD boundary. a. RNAsequencing data from acute myeloid leukemia (TCGA-LAML; $\mathrm{n}=151$ ), papillary renalcell carcinoma (TCGA-KIRP; $\mathrm{n}=270$ ), childhood acute lymphoblastic leukemia (OligoT BCP-ALL; $\mathrm{n}=201$ ), and from normal bone marrow ( $\mathrm{n}=20$ ) b. Microarray-based gene expression data from high hyperdiploid and ETV6/RUNX1-positive ALL. The center of the boxplot is the median and lower/upper hinges correspond to the first/third quartiles; whiskers are 1.5 times the interquartile range and data beyond this range are plotted as individual points. c. RNA-seq data from high hyperdiploid cases in the oligo(dT) dataset, analyzing commonly gained chromosomes separately from the remaining chromosomes.

Supplementary Table 1. Overview of mass-spectrometry data

|  | Proteins <br> (Gene symbol, 1\% FDR) | Peptides <br> (Unique, 1\% FDR) | Peptide-spectrum matches <br> (total) |
| :--- | :---: | :---: | :---: |
| SET A | 9,403 | 136,521 | 236,759 |
| SET B | 9,331 | 141,510 | 217,436 |
| SET C | 9,085 | 120,575 | 190,932 |
| Total | 10,138 | 174,966 | 645,127 |

FDR, false discovery rate

| Case No. | Group | Gender | Age | WBC count ( $\times 10^{\circ} 9$ ) | Bone marrow blast \% | Karyotye ${ }^{\text {20] }}$ | WGS | wes | SNParray analysis | RiboZero RNA-seq | Oigigo(d) RNA-seq | Proteomics | Hi-C | Chromosome morphology |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| HeH_1 | High hyperifiploid | M | 1 | 36 | 67 | $54, \times \mathrm{Y},+\mathrm{x},+6,+14,+15,+17,+18,+21,+21$ | n | $y$ | y | y | y | y | n | n |
| HeH_2 | High hyperdiploid | M | 1 | 30 | 65 |  | y | n | y | y | , | y |  | y |
| HeH_3 | High hyperdiploid | M | 2 | 14 | 70 | $56, X Y,+X,+4,+6,+10,+14,+17,+18,2+\operatorname{der}(19)(1 ; 1919)(911 ; p 13),+21,+21$ | y | n | y | y | y | y | n | $y$ |
| HeH_4 | High hyperdiploid | M | 3 | 5.4 | 94 | $55, X Y,+$, dup (1) (T12q25), $+4,+6,+10,+14,+17,+18,+21,+21$ []ased on FISH and SNP array analysis] | n | $v$ | y | y | y | y | n | n |
| HeH-5 | High hyperdiploid | M | 3 | 98 | 95 | $56, X Y,+x, \operatorname{der}(1)$ Pins $(1, ?)(921 ; 7)+4,+6,+8,+10,+14,+17,+18,+21,+21$ | n | $y$ | y | y | , | y | n | y |
| HeH_6 | High hyperdiploid | M | 3 | 51 | NK | $55 . X Y,+$ + $+4,+5,+6$, idicic 7 ( $(P 11)+8,+10,+14,+17,+21$ | n | , | y | y | y | , | n | y |
| HeH7 | High hyperifiploid | M | 3 | 6.6 | NK | $54, X Y+$ + + +4, $+6,+10,114,17,+18,+21$ | n | v | y | y | y | y | n | y |
| HeH_8 | High hyperifiploid | F | 3 | 10 | 50 | $53 . \mathrm{XX},+2,+6,+10,+11,+18,+18,+21 / 54,1 \mathrm{dem},+8$ | n | $y$ | y | y | y | y | n | y |
| нен_9 | High hyperifiploid | F | 3 | 19 | NK | $55, \times$ X, $+\mathrm{X},+4,6,+7,+10,+14,+17,+18,+21$ | n | y | y | y | y | y | y | y |
| Heel_10 | High hyperdiploid | M | 3 | 90 | 90 | $56, X Y,+X,+4,+6,+8,+10,+14,+17,+18,+21,+21$ | n | y | y | y | n | y | y | y |
| Het_11 | High hyperdiploid | M | 4 | 4.2 | NK | 61, X, $-7,+3,+4,+5,+6,+8,+10,+10,+13,+14,+14,+17,+18,+18,+21,+21$ | n | $y$ | $y$ | y | y | y | n | $y$ |
| HeH-12 | High hyperaiploid | M | 4 | 17 | 80 | $56, \times \mathrm{Y},+\mathrm{x},+3,4,4,+6,+8,+10,+14,+16,+18,+21 / 56$, , dem , (7) (910) | y | n | y | y | y | y | n | y |
| Heth 13 | High hyperdiploid | F | 4 | 16 | 84 | $52 . \mathrm{X},+x,+6,+14,+17,+18,+21 / 53, \mathrm{dem},+21$ | y | n | y | y | y | y | n | $y$ |
| Heth 14 | High hyperciplold | M | 7 | 8.1 | 64 |  | n | $y$ | y | y | y | y | n | y |
| Hel_-15 | High hyperdiploid | M | 8 | 1.8 | 91 | $54, X Y,+X, 4+4,6,+8,+10,+18,+21,+21$ | n | $y$ | y | y | n | y | n |  |
| Het_16 | High hyperdiploid | M | 10 | 4.1 | NK | $54, X Y Y+X,+6,+10,+14,+17,+18,+21,+21$ | n | $y$ | y | y | y | y | n | y |
| Heel-17 | High hyperdiploid | M | 13 | ${ }_{6}$ | 90 |  | y | $y$ | y | y | y | y | n | $y$ |
| Het_18 | High hyperdiploid | F | 16 | 2 | NK | $60, X \mathrm{X},+\mathrm{x}, 4,4+5,+6,+7,+8,+10,+14,+14,+17,+18,+21,+21,+21$ | n | $y$ | y | y | y | y | n | n |
| Hel-19 | High hyperdiploid | M | 2 | 54 | NK |  | n | $y$ | y | n | y | n | n | y |
| Het 20 | High hyperdiploid | F | 4 | 6.8 | NK | $52 . \mathrm{X} \times+\mathrm{x},+4,+8,10,+18,+21$ | n | n | y | n | y | n | n | n |
| Heth 21 | High hyperdiploid | F | 6 | 6.2 | NK | $53, \times \mathrm{X}+\mathrm{x},+4,+6,+14,+17,+21,+21$ | n | n | y | n | y | n | n | y |
| HeH. 22 | High hyperdiploid | F | 4 | 4.8 | ${ }^{93}$ | $54, x \mathrm{X},+\mathrm{X},+44,6,+10,+17,+18,+21,+21$ [based on FISH and SNP array analysis] | y | n | y | n | y | n | n | $y$ |
| Heth 23 | High hypertiploid | F | 11 | 4.7 | 75 |  | n | n | y | n | y | n | n | y |
| Heth 24 | High hypertiploid | F | 8 | 5 | 60 |  | y | n | y | n | y | n | n | y |
| Het 25 | High hyperdiploid | F | 4 | 3 | 90 |  | y | n | y | n | y | n | n | $y$ |
| Heth 26 | High hyperdiploid | F | 15 | 3.5 | NK |  | n | $y$ | y | n | y | n | n | y |
| Heth 27 | High hyperciploid | M | 5 | 16 | 80 |  | y | $y$ | y | n | y | n | n | y |
| HeH-28 | High hyperdiploid | F | 2 | 129 | ${ }^{\text {NK }}$ | $53, \times \mathrm{X},+x_{2}+8,+14,+15,+17,+21,+21$ | n | n | y | n | y | n | n | $y$ |
| HeH 29 | High hyperifiploid | F | 4 | 7.4 | 70 |  | n | n | y | n | y | n | n | y |
| Heth30 | High hyperifiploid | M | 5 | 2.2 | NK | $55 . X Y,++,+6,+9,+14,+14,+17,+18,+21,+21$ | n | n | y | n | y | n | n | y |
| Heth31 | High hypertiploid | M | 3 | 15 | 75 | $57, \times Y,+x,+Y+4,+5,+6,+10,+14,+17,+21,+21,+21$ | n | n | y | n | y | n | n | $y$ |
| HeH. 32 | High hyperdiploid | F | 2 | 17 | NK | $56, \mathrm{X},+\mathrm{X},+4,+6,+8,+10,+14,+17,+18,+21,+21$ | , | $y$ | y | n | y | n | $n$ | $y$ |
| Heth33 | High hyperdiploid | F | 3 | 5 | NK | $57, \times \mathrm{XX},+\mathrm{x},+44,+6,+8,+8,+12,+14,+17,+18,+21,+21$ S58, idem, $+10[$ [based on SNP array a nalysis] | n | n | y | n | y | n | n | $y$ |
| Heth34 | High hyperdiploid | F | 3 | 3.8 | 40 | $58, X \mathrm{X},+\mathrm{X}, 4+6,6+9,+10,+11,+12,+14,+17,+18,+21,+21$ | n | $y$ | y | n | y | n | n | n |
| Heth35 | High hyperdiploid | F | 5 | 6.3 | NK | $53, \mathrm{XX},+4,+6,10,+14,+18,+21,+21$ | , | n | y | n | y | n | n | n |
| Heth36 | High hyperifiploid | F | 5 | 15 | 85 | $55.10 \times$, $\mathrm{X}+2,+44,6,6+8,14,+21,+21,+21$ [based on SNP array analysis] | n | n | y | n | y | n | n | n |
| Heh. 37 | High hyperdiploid | M | 1 | 85 | 90 | $55 . X Y,+$ + $+4,+6,+14,+17,18,+21,+21,+22$ | n | $y$ | y | n | y | n | n | n |
| Heth38 | High hyperdiploid | M | 3 | 2.1 | NK |  | , | n | y | n | y | n | n | y |
| Heth39 | High hypertiploid | M | 3 | 30 | NK |  | n | n | y | n | y | n | n | n |
| Hel_ 40 | High hyperdiploid | F | 1 | 3.4 | NK | $54, \times \mathrm{X}, \mathrm{x},+6,+8,+14,+17,+18,+21,+21$ | n | n | $y$ | n | y | n | $n$ | $y$ |
| Hel.41 | High hyperdiploid | F | 2 | 9.7 | 35 | $54, \mathrm{XX},+\mathrm{X},+6,+10,+14,+17,+18,+21,+21$ [based on FISH and SNP array analysis] | n | y | y | n | y | n | n | n |
| Hel. 42 | High hyperdiploid | M | 7 | 1.7 | NK | $52-59, X Y+x+44,5+, 6,+8,+10,+10$, der (13; $141 /(910 ; 910) \mathrm{c},+14,+17,+18,+18,+20,+21,+22$ | n | n | y | n | y | n | y | , |
| Hehta3 | High hyperdiploid | M | 2 | 6.2 | NK | $63, X,+X,+Y,+4,+\operatorname{der}(5)$ )(1-5) (112; $211++6,+8,+9,+10,+11,+12,+14,+14,+17,+18,+21,+21,+22$ | y | n | y | ${ }^{\text {n }}$ | ${ }^{\text {y }}$ | n | n | y |
| Hel. 44 | High hyperifiplodd | M | 2 | 8.8 | 36 | $54, \times \mathrm{Y},+\mathrm{X}, 4,+6,+10,+14,+17,+18,+21 / 55$, deem, +21 | n | n | y | n | y | n | n | y |
| Hel_45 | High hyperdiploid | M | 6 | 2.6 | 62 | $57-58, \mathrm{XY},+\mathrm{X}, 4,+6,+9,+10,+14,+17,+18,+18,+21,+21$ | n | $y$ | y | n | y | n | n | y |
| HeH. 46 | High hyperdiploid | M | 6 | 3.2 | 87 | $55, X Y+X,+4,17() / 910)+8,+9,+10,+14,+18,+21,+21$ | n | n | y | ${ }^{\text {n }}$ | ${ }^{\text {y }}$ | n | n | ${ }^{n}$ |
| Hel-47 | High hyperdiploid | M | 2 | 12 | NK | $57, \chi \mathrm{Y},+\mathrm{X},+\gamma+4,+6,+10,+14,+17,+18,+21,+21,+\mathrm{mar}$ | n | n | y | n | y | n | n | y |
| Heh_48 | High hyperdiploid | F | 4 | 23 | ${ }^{85}$ | $52.55 . \times \mathrm{xX},+\mathrm{x}, 66,+10,+10,+14,+14,+18,+21,+21$ | n | n | $y$ | n | n | n | y | $y$ |
| Eve/RuNx1_1 | enveirunx | F | 3 | 30 | 78 |  | n | $y$ | y | y | $y$ | y | n | $y$ |
| ENV/RUNX1_2 | enve/runx | F | 3 | 16 | 75 |  | n | $y$ | y | y | y | y | n | n |
| ENV/RUNX1_3 | engirunx | F | 3 | 20 | NK |  | n | $y$ | y | y | y | y | n | , |
| ENV/RUNX1_4 | ENv/RuNx | M | 4 | 164 | ${ }^{93}$ |  | n | $y$ | y | y | y | y | n | y |
| ENV/RUNX1_5 | enverunxl | M | 4 | 7.8 | 86 | 46,XX, del(12)(p13P131), (112;21)(p13;922) | n | $y$ | y | y | n | y | n | y |
| ENV/RUNX1_6 | envirunx | M | 5 | 13 | 48 |  | n | $y$ | $y$ | y | y | y | y | , |
| EvN6/RuNx17 | engirunxi | M | 6 | 31 | 95 | 45-46,XY,del(6)(q), , add(12)(P11), (12; 21) (p13;922), inc | n | $y$ | $y$ | y | $y$ | y | n | $y$ |
| Eve/Runx1_8 | eng/runxi | M | 6 | 5 | 86 |  | n | $y$ | y | y | y | y | n | y |
| ENE/RUNX1.9 | eng/runxl | F | 7 | 28 | NK | 46.x.x.(12; 211) p13;q22) $^{\text {a }}$ | n | n | y | y | y | y | n | , |
| Eve/RuNx1_10 | eng/runxi | M | 4 | 55 | NK |  | n | n | y | n | y | n | n |  |
| Eve/RuNx1_11 | ENG/RUNXI | F | 7 | 2.1 | 53 |  | n | n | y | n | y | n | n | y |
| ENV/RUNX1_12 | ENG/RUNXI | M | 3 | 4.1 | ${ }^{\text {NK }}$ |  | n | n | y | n | , | n | n | , |
| EvV6/RUNX1_13 | ENG/RUNXI | F | 6 | 8.1 | NK |  | n | n | y | n | y | n | n | , |
| EvV6/RUNX1_14 | ENG/RUNXI | F | 10 | 26 | 30 | ??, , $\cdot x+4,+4,+6,+6,+8,8,8+11,+10,412,21)(p 13,922) \times 1-2,+14,+14,+17,+17,+18,+18,+21,+21,+21$ | n | $y$ | y | n | , | n | , | y |
| ENV/RUNX1_15 | ENG/RUNXI | M | 4 | 25 | NK |  | n | n | y | n | y | n | n | n |
| ENV/RUNX1_16 | engirunxi | F | 1 | 30.7 | 68 |  | n | n | y | n | v | n | n | y |
| ENE/RUNX11.17 | EvelRUNXI | M | 6 | 28 | ${ }^{\text {NK }}$ |  | n | n | ${ }^{\text {y }}$ | ${ }^{n}$ | y | n | n | ${ }^{n}$ |
| ENV/RUNX1_18 | ENG/RUNXI | M | 10 | 5.5 | NK | 46,XX, (112;21)(p13;q22) | n | n | y | n | , | n | n | y |
| Eve/Runx1_19 | ENG/RUNXI | M | 6 | 14 | 81 | 46,XY, (112;21)(p13,q22)/46,idem,add(12)(p 13 ) | n | n | y | n | , | n | n | y |
| Eve/Runx1_20 | envirunx | M | 8 | $\pi$ | 98 |  | n | , | $y$ | n | y | n | n | $y$ |
| ENV/RUNX1_21 | ENE/RUNXI | M | 6 | 4.5 | 72 |  | n | n | , | n | , | n | n | , |
| ENV6/RUNX1_22 | ENG/RUNXI | M | 3 |  | ${ }^{83}$ |  | n | $n$ | y | n | y | n | n | y |

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Supplementary Data 2. Somatic mutations detected in 27 cases of childhood acute lymphoblastic leukemia

## Too large for printing

## Supplementary Data 3. Log2-values of relative levels of $\mathbf{1 0 , 1 3 8}$ gene-centric proteins detected and fully quantified in any one of the 3 TMT-sets

## Too large for printing

Supplementary Data 4. Expression values of $\mathbf{8 , 4 8 0}$ proteins detected in 27 childhood acute lymphoblastic leukemias

Too large for printing

## Too large for printing

## Too large for printing

## Too large for printing

| Gene set | SIZE | ES | NES | NOM p -val | FDR q-val | FWER p-val | Rank at max leading edge |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| GO_CHROMATIN_MODIFICATION | 409 | -0.20822823 | -4.711899 | 0 | 0 | 0 | 4515 tags $=73 \%$, list=53\%, signal $=149 \%$ |
| GO_CHROMATIN_ORGANIZATION | 446 | -0.19487198 | -4.563794 | 0 | 0 | 0 | 4515 tags $=72 \%$, list=53\%, signal $=146 \%$ |
| GO_COVALENT_CHROMATIN_MODIFICATION | 268 | -0.20880376 | $-3.9299788$ | 0 | 0 | 0 | 4515 tags $=74 \%$, list=53\%, signal $=152 \%$ |
| GO_PEPTIDYL_LYSINE_MODIFICATION | 249 | -0.20713407 | -3.7435987 | 0 | 0 | 0 | 5170 tags $=81 \%$, list=61\%, signal $=202 \%$ |
| GO_NUCLEAR_CHROMOSOME | 340 | -0.19142391 | -4.133247 | 0 | 0 | 00 | 4150 tags $=67 \%$, list= $49 \%$, signal $=127 \%$ |
| GO_CHROMATIN | 284 | -0.19142766 | $-3.742697$ | 0 | 0 | 0 | 4101 tags=67\%, list= $48 \%$, signal $=125 \%$ |
| GO_NUCLEAR_CHROMATIN | 180 | -0.20982257 | $-3.2515132$ | 0 | 0 | 0 | 4144 tags $=69 \%$, list= $49 \%$, signal $=133 \%$ |
| GO_RESPIRATORY_CHAIN | 63 | -0.3199164 | -3.0175676 | 0 | 0 | 0 | 4572 tags=86\%, list=54\%, signal $=185 \%$ |
| GO_NUCLEIC_ACID_BINDING_TRANSCRIPTION_FACTOR_ACTVITY | 484 | -0.19176981 | $-4.6464334$ | 0 | 0 | 0 | 4105 tags $=67 \%$, list= $48 \%$, signal $=122 \%$ |
| GO_SEQUENCE_SPECIIFIC_DNA_BINDING | 425 | -0.18665822 | -4.3051186 | 0 | 0 | 0 | 2924 tags $=52 \%$, list $=35 \%$, signal $=76 \%$ |
| GO_REGULATORY_REGION_NUCLEIC_ACID_BINDING | 379 | -0.18015118 | -3.9834127 | 0 | 0 | 0 | 4198 tags=67\%, list=50\%, signal $=126 \%$ |
| go_Chromatin_BINDING | 277 | -0.19498594 | -3.7340603 | 0 | 0 | 0 | 3755 tags $=63 \%$, list=44\%, signal $=110 \%$ |
| GO_DOUBLE_STRANDED_DNA_BINDING | 369 | -0.16288863 | -3.557147 | 0 | 0 | 0 | 4122 tags $=64 \%$, list= $49 \%$, signal $=120 \%$ |
| GO_IRANSCRIPTION_FACTOR_ACTIVIT_PROTEIN_BINDING | 364 | -0.14537601 | $-3.1549299$ | 0 | 0 | 0 | 3919 tags $=60 \%$, list= $46 \%$, signal $=107 \%$ |
| GO_RNA_POLYMERASE_II_TRANSCRIPTION_FACTOR_ACTVITY_SEQUENCE_SPECIFIC_DNA_BINDING | 233 | -0.17601933 | -3.132979 | 0 | 0 | 0 | 2332 tagss $=45 \%$, list $=28 \%$, signal $=60 \%$ |
| REACTOME_GENERIC_TRANSCRIPTION_PATHWAY | 141 | -0.32496488 | $-4.4203773$ | 0 | 0 | 0 | 3422 tags $=72 \%$, list= $40 \%$, signal $=119 \%$ |
| REACTOME_G2_M_CHECKPOINTS | 37 | -0.41370836 | -2.9813194 | 0 | 0 | 0 | 4067 tags $=89 \%$, list=48\%, signal $=171 \%$ |
| REACTOME_CELL_CYCLE | 313 | -0.14381069 | $-2.9727776$ | 0 | 0 | 0 | 5269 tags $=76 \%$, list=62\%, signal $=194 \%$ |
| GO_CHROMATIN_REMODELING | 103 | -0.2643032 | -3.1186914 | 0 | $1.62 \mathrm{E}-04$ | 0.001 | 4122 tags $=75 \%$, list= $49 \%$, signal $=144 \%$ |
| GO_CORE_PROMOTER_PROXIMAL_REGION_DNA_BINDING | 156 | -0.20468259 | -2.9279506 | 0 | $1.25 \mathrm{E}-04$ | 0.001 | 4055 tags $=68 \%$, list= $48 \%$, signal $=128 \%$ |
| REACTOME_ACTIVATION_OF_ATR_IN_RESPONSE_TO_REPLICATION_STRESS | 31 | -0.43459332 | -2.872156 | 0 | 2.28E-04 | 0.001 | 3711 tags=87\%, list=44\%, signal $=154 \%$ |
| GO_DNA_CONFORMATION_CHANGE | 171 | -0.19402522 | $-2.9805303$ | 0 | $2.67 \mathrm{E}-04$ | 0.002 | 4137 tags $=68 \%$, list= $49 \%$, signal $=130 \%$ |
| GO_NADH_DEHYDROGENASE_COMPLEX | 40 | -0.38722274 | $-2.8776546$ | 0 | 3.69E-04 | 0.002 | 4572 tags=93\%, list=54\%, signal $=200 \%$ |
| GO_INTEGRATOR_COMPLEX | 12 | -0.65682507 | -2.8708763 | 0 | 3.08E-04 | 0.002 | 2210 tags $=92 \%$, list=26\%, signal $=124 \%$ |
| KEGG_CEL_CYCLE | 96 | -0.2298955 | $-2.6562445$ | 0 | 0.002027473 | 0.002 | 3370 tags $=63 \%$, list=40\%, signal $=103 \%$ |
| REACTOME_RESPIRATORY_ELECTRON_TRANSPORT | 57 | -0.3096948 | -2.7782145 | 0 | 3.81E-04 | 0.002 | 5569 tags $=96 \%$, list=66\%, signal $=280 \%$ |
| GO_PROTEIN_DEALKYLATION | 24 | -0.48988795 | -2.892131 | 0 | $4.63 \mathrm{E}-04$ | 0.004 | 3628 tags $=92 \%$, list=43\%, signal $=160 \%$ |
| GO_CHROMOSOMAL_REGION | 249 | -0.15560369 | $-2.8253012$ | 0 | 5.14E-04 | 0.004 | 4437 tags=67\%, list=52\%, signal $=138 \%$ |
| GO_HISTONE_METHYLTRANSFERASE_COMPLEX | 59 | -0.31242496 | -2.8045702 | 0 | 4.50E-04 | 0.004 | 5126 tags=92\%, list=61\%, signal $=230 \%$ |
| GO_HISTONE_DEMETHYLASE_ACTVITY | 22 | -0.5035776 | -2.7920105 | 0 | $4.35 \mathrm{E}-04$ | 0.004 | 1907 tags $=73 \%$, list=23\%, signal $=94 \%$ |
| GO_HISTONE_BINDING | 117 | -0.22299363 | -2.7615194 | 0 | 3.91E-04 | 0.004 | 1903 tagss $=44 \%$, list=22\%, signal $=57 \%$ |
| Go_Llgase_Activity | 271 | -0.14284177 | $-2.7571561$ | 0 | 3.56E-04 | 0.004 | 4675 tags $=69 \%$, list=55\%, signal $=149 \%$ |
| go_oxidoreductase_COMPLEX | 79 | -0.26770523 | $-2.7602043$ | 0 | 5.06E-04 | 0.005 | 4617 tags=81\%, list=55\%, signal= $176 \%$ |
| REACTOME_RESPIRATORY_ELECTRON_TRANSPORT_ATP_SYNTHESIS_BY_CHEMIOSMOTIC_COUPLING_AND_HEAT_PRODUCTION_BY_UNCOUPLING_PROTEINS_ | 67 | -0.2734732 | -2.655756 | 0 | 8.00E-04 | 0.005 | 5668 tags $=94 \%$, list $=67 \%$, signal $=282 \%$ |
| GO_PROTEIN_UBIQUITINATION | 388 | -0.13083683 | -2.870379 | 0 | 6.15E-04 | 0.006 | 6039 tags=84\%, list=71\%, signal $=278 \%$ |
| GO_N_ACYLTRANSFERASE_ACTVITY | 71 | -0.27377766 | $-2.7244554$ | 0 | 4.92E-04 | 0.006 | 4144 tags $=76 \%$, list= $49 \%$, signal $=148 \%$ |
| GO_CHROMOSOME_TELOMERIC_REGION | 112 | -0.2189791 | -2.688354 | 0 | 8.92E-04 | 0.01 | 4070 tags $=70 \%$, list= $48 \%$, signal $=132 \%$ |
| GO_DNA_DEPENDENT_ATPASE_ACTIVIT | 67 | -0.275116 | -2.662945 | 0 | 7.44E-04 | 0.01 | 4137 tags $=76 \%$, list= $49 \%$, signal $=148 \%$ |
| KEGG_PARKINSONS_DISEASE | 83 | -0.23051004 | $-2.5006206$ | 0 | 0.005242439 | 0.01 | 5722 tags $=90 \%$, list $=68 \%$, signal $=276 \%$ |
| GO_METHYLATED_HISTONE_BINDING | 40 | -0.35414836 | -2.6468227 | 0 | 8.36E-04 | 0.012 | 1886 tags $=58 \%$, list=22\%, signal $=74 \%$ |
| REACTOME_MRNA_PROCESSING | 142 | -0.182872 | $-2.594382$ | 0 | 0.001932084 | 0.014 | 6233 tags $=92 \%$, list=74\%, signal $=341 \%$ |
| GO_DIOXYGENASE_ACTIVITY | 55 | -0.29380834 | $-2.569609$ | 0 | 0.001558365 | 0.024 | 3381 tags $=69 \%$, list= $40 \%$, signal $=114 \%$ |
| GO_ATP_DEPENDENT_DNA_HELICASE_ACTVITY | 31 | -0.3841194 | $-2.5673566$ | 0 | 0.001460967 | 0.024 | 4137 tags=87\%, list=49\%, signal $=170 \%$ |
| GO_PRC1_COMPLEX | 10 | -0.6620967 | $-2.5375957$ | 0 | 0.002016454 | 0.025 | 2870 tags $=100 \%$, list= $34 \%$, signal $=151 \%$ |
| GO_MLL1_2_COMPLEX | 26 | -0.4140183 | $-2.5317245$ | 0 | 0.001925577 | 0.026 | 4324 tags=92\%, list=51\%, signal= $188 \%$ |
| GO_SWI_SNF_SUPERFAMILY_TYPE_COMPLEX | 61 | -0.27817976 | $-2.5243893$ | 0 | 0.001777455 | 0.026 | 3494 tags $=69 \%$, list=41\%, signal $=116 \%$ |
| GO_DEMETHYLASE_ACTVITY | 27 | -0.42045632 | -2.5569108 | 0 | 0.001546482 | 0.027 | 2098 tags=67\%, list=25\%, signal=88\% |
| GO_SNRNA_PROCESSING | 21 | -0.4999549 | -2.7454185 | 0 | 0.002823366 | 0.031 | 3844 tags=95\%, list= $45 \%$, signal $=174 \%$ |
| GO_PROTEIN_METHYLTRANSFERASE_ACTVITY | 57 | -0.29218847 | -2.547581 | 0 | 0.001679306 | 0.031 | 4676 tags $=84 \%$, list=55\%, signal $=187 \%$ |
| GO_TRANSFERASE_ACTIVIT_TRANSFERRING_ACYL_GROUPS_OTHER_THAN_AMINO_ACYL_GROUPS | 129 | -0.19607608 | $-2.5466044$ | 0 | 0.001590922 | 0.031 | 4144 tags $=68 \%$, list= $49 \%$, signal $=132 \%$ |
| REACTOME_CELL_CYCLE_MITOTIC | 268 | -0.13229915 | $-2.4961467$ | 0 | 0.004681622 | 0.037 | 5269 tags $=75 \%$, list=62\%, signal $=192 \%$ |
| GO_REGULATION_OF_CELL_CYCLE_PROCESS | 370 | -0.122890405 | $-2.7303624$ | 0 | 0.003115489 | 0.038 | 6057 tags=83\%, list=72\%, signal $=279 \%$ |
| GO_PROTEIN_ACETYLATION | 97 | -0.23788531 | $-2.7273772$ | 0 | 0.002832263 | 0.038 | 5170 tags $=85 \%$, list=61\%, signal $=214 \%$ |
| REACTOME_PROCESSING_OF_CAPPED_INTRON_CONTAINING_PRE_MRNA | 129 | -0.18181092 | $-2.4658682$ | 0 | 0.004707857 | 0.042 | 6233 tags=91\%, list=74\%, signal $=341 \%$ |
| GO_NUCLEAR_CHROMOSOME_TELOMERIC_REGION | 88 | -0.22882618 | -2.4684777 | 0 | 0.003026905 | 0.048 | 4436 tags $=75 \%$, list=52\%, signal $=156 \%$ |
| KEGG_HUNTINGTONS_IISEASE | 124 | -0.17821258 | $-2.3442972$ | 0 | 0.016149033 | 0.048 | 6233 tags=91\%, list=74\%, signal=340\% |


| Supplementary Data 10. Enriched gene sets in ETV6/RUNX1 -positive vs high hyperdiploid acute lymphoblastic leukemias based on RiboZero RNA-seq data |
| :--- |
| Gene set |


| Gene set | SIZE | ES | NES | NOM p -val | FDRq-val | FWER p-val | RANK AT MAX LEADING EDGE |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| GO_NUCLEAR_CHROMOSOME_SEGREGATION | 189 | -0.22923005 | -3.7736554 | 0 | 0 | 0 | 4779 tags=61\%, list=39\%, signal=99\% |
| GO_HOMOPHILIC_CELL_ADHESION_VIA_PLASMA_MEMBRANE_ADHESION_MOLECULES | 68 | -0.3713941 | -3.6778214 | 0 | 0 | 0 | 2153 tags=54\%, list= $17 \%$, signal $=66 \%$ |
| GO_SISTER_CHROMATID_SEGREGATION | 161 | -0.23011418 | -3.4397635 | 0 | 0 | 0 | 4776 tags=61\%, list=39\%, signal=99\% |
| GO_CELL_CELL_ADHESION_VIA_PLASMA_MEMBRANE_ADHESION_MOLECULES | 87 | -0.30793336 | -3.3347015 | 0 | 0 | 0 | 2605 tags=52\%, list=21\%, signal=65\% |
| GO_ORGANELLE_FISSION | 404 | -0.14292921 | -3.320054 | 0 | 0 | 0 | 4943 tags=54\%, list=40\%, signal=87\% |
| GO_CELL_DIVISION | 393 | -0.14451775 | -3.3179195 | 0 | 0 | 0 | 6675 tags=68\%, list=54\%, signal $=144 \%$ |
| GO_DNA_REPLICATION | 190 | -0.19870014 | -3.19962 | 0 | 0 | 0 | 7961 tags=84\%, list=65\%, signal $=235 \%$ |
| GO_CHROMOSOME_SEGREGATION | 231 | -0.18247779 | -3.1942134 | 0 | 0 | 0 | 4779 tags=57\%, list=39\%, signal=91\% |
| GO_CHROMOSOME_CENTROMERIC_REGION | 158 | -0.24284896 | -3.5777931 | 0 | 0 | 0 | 5076 tags=65\%, list=41\%, signal $=109 \%$ |
| GO_CONDENSED_CHROMOSOME | 163 | -0.24331744 | -3.5497098 | 0 | 0 | 0 | 5203 tags=66\%, list=42\%, signal $=113 \%$ |
| GO_CENTROSOME | 425 | -0.1419371 | -3.3600364 | 0 | 0 | 0 | 6165 tags $=64 \%$, list $=50 \%$, signal $=123 \%$ |
| GO_CHROMOSOMAL_REGION | 299 | -0.16845706 | -3.277777 | 0 | 0 | 0 | 6378 tags $=68 \%$, list=52\%, signal $=138 \%$ |
| GO_KINETOCHORE | 107 | -0.27244452 | -3.2519007 | 0 | 0 | 0 | 5076 tags=68\%, list=41\%, signal $=115 \%$ |
| GO_UBIQUITIN_LIKE_PROTEIN_TRANSFERASE_ACTIVITY | 361 | -0.13600431 | -2.9283817 | 0 | 0 | 0 | 6118 tags=63\%, list=50\%, signal= $=121 \%$ |
| REACTOME_GENERIC_TRANSCRIPTION_PATHWAY | 294 | -0.25508022 | -5.063831 | 0 | 0 | 0 | 6149 tags $=75 \%$, list=50\%, signal $=146 \%$ |
| GO_MITOTIC_NUCLEAR_DIVISION | 325 | -0.14703423 | $-3.088663$ | 0 | $8.76 \mathrm{E}-05$ | 0.001 | 4679 tags $=52 \%$, list=38\%, signal=82\% |
| REACTOME_G2_M_CHECKPOINTS | 41 | -0.39166096 | -2.968715 | 0.002016129 | 0.001182141 | 0.003 | 5105 tags=80\%, list=41\%, signal=137\% |
| GO_MICROTUBULE_CYTOSKELETON_ORGANIZATION | 261 | -0.16103497 | -3.0029573 | 0 | 3.20E-04 | 0.004 | 4429 tags=52\%, list=36\%, signal= $=9 \%$ |
| GO_CONDENSED_CHROMOSOME_CENTROMERIC_REGION | 88 | -0.27354988 | -2.9262466 | 0 | 5.94E-04 | 0.004 | 5192 tags $=69 \%$, list= $=42 \%$, signal $=119 \%$ |
| GO_SPINDLE | 251 | -0.15763737 | -2.9065053 | 0 | 5.09E-04 | 0.004 | 5507 tags $=60 \%$, list=45\%, signal $=107 \%$ |
| KEGG_CELL_CYCLE | 117 | -0.20907022 | -2.6706586 | 0.001941748 | 0.002068068 | 0.004 | 6607 tags $=74 \%$, list=54\%, signal $=159 \%$ |
| REACTOME_CELL_CYCLE_MITOTIC | 299 | -0.14688495 | -2.886092 | 0 | 0.001059651 | 0.004 | 6143 tags $=64 \%$, list=50\%, signal $=125 \%$ |
| REACTOME_MITOTIC_PROMETAPHASE | 82 | -0.26510605 | -2.8809922 | 0 | $7.95 \mathrm{E}-04$ | 0.004 | 5768 tags $=73 \%$, list=47\%, signal= $=137 \%$ |
| GO_CELL_MORPHOGENESIS_INVOLVED_IN_NEURON_DIFFERENTIATION | 208 | -0.18215217 | -2.9635642 | 0 | 4.34E-04 | 0.006 | 2887 tags=41\%, list=23\%, signal=53\% |
| GO_SISTER_CHROMATID_COHESION | 103 | -0.25218946 | -2.950217 | 0 | 4.64E-04 | 0.007 | 5768 tags $=72 \%$, list=47\%, signal= $=134 \%$ |
| GO_REGULATION_OF_CELL_DIVISION | 189 | -0.18263744 | -2.9470596 | 0 | 4.28E-04 | 0.007 | 4953 tags=58\%, list=40\%, signal=96\% |
| GO_CELL_PART_MORPHOGENESIS | 386 | -0.12743823 | -2.8958368 | 0 | $4.55 \mathrm{E}-04$ | 0.008 | 2915 tags=36\%, list=24\%, signal=46\% |
| REACTOME_ACTIVATION_OF_ATR_IN_RESPONSE_TO_REPLICATION_STRESS | 35 | -0.3865776 | -2.7242105 | 0 | 0.00125596 | 0.008 | 5105 tags $=80 \%$, list=41\%, signal $=136 \%$ |
| REACTOME_CELL_CYCLE | 383 | -0.12040669 | -2.6680768 | 0 | 0.00129085 | 0.01 | 9463 tags $=89 \%$, list=77\%, signal $=371 \%$ |
| GO_REGULATION_OF_SYNAPSE_ORGANIZATION | 52 | -0.34102657 | -2.8697016 | 0 | 5.82E-04 | 0.011 | 5528 tags $=79 \%$, list=45\%, signal $=142 \%$ |
| GO_CALCIUM_ION_BINDING | 352 | -0.1213069 | -2.6610134 | 0 | 0.004746517 | 0.011 | 2153 tags $=29 \%$, list $=17 \%$, signal $=34 \%$ |
| REACTOME_ACTIVATION_OF_THE_PRE_REPLICATIVE_COMPLEX | 29 | -0.41184217 | -2.645802 | 0 | 0.001333416 | 0.012 | 5132 tags $=83 \%$, list= $42 \%$, signal $=142 \%$ |
| GO_CORE_PROMOTER_PROXIMAL_REGION_DNA_BINDING | 228 | -0.15145174 | -2.651243 | 0 | 0.003747146 | 0.013 | 1789 tags $=29 \%$, list=15\%, signal $=34 \%$ |
| GO_MRNA_PROCESSING | 382 | -0.12812349 | -2.825878 | 0 | 7.95E-04 | 0.016 | 10044 tags=94\%, list=82\%, signal=494\% |
| GO_NEURON_PROJECTION_GUIDANCE | 108 | -0.23592031 | -2.8161657 | 0 | $8.89 \mathrm{E}-04$ | 0.019 | 2138 tags=41\%, list=17\%, signal=49\% |
| GO_CELL_CYCLE_PHASE_TRANSITION | 235 | -0.15793233 | -2.802743 | 0 | 9.72E-04 | 0.022 | 6634 tags=69\%, list=54\%, signal=148\% |
| GO_DNA_DEPENDENT_ATPASE_ACTIVITY | 76 | -0.25511605 | -2.5920396 | 0 | 0.005192522 | 0.024 | 7410 tags=86\%, list=60\%, signal=213\% |
| GO_REGULATION_OF_SYNAPSE_STRUCTURE_OR_ACTIVITY | 118 | -0.21892205 | -2.7796605 | 0 | 0.001172515 | 0.028 | 5366 tags $=65 \%$, list=44\%, signal $=115 \%$ |
| GO_NEURON_PROJECTION_MORPHOGENESIS | 225 | -0.15964186 | -2.7558901 | 0 | 0.001394536 | 0.035 | 2887 tags=39\%, list=23\%, signal=50\% |
| GO_POSITIVE_REGULATION_OF_CELL_CYCLE_PROCESS | 193 | -0.16862465 | -2.7556095 | 0 | 0.00132813 | 0.035 | 6251 tags=67\%, list=51\%, signal=135\% |
| GO_CONDENSED_NUCLEAR_CHROMOSOME | 64 | -0.26370007 | -2.4751134 | 0 | 0.005260806 | 0.046 | 3697 tags=56\%, list=30\%, signal= $=80 \%$ |


| Gene set | SIIE | ES | NES |
| :---: | :---: | :---: | :---: |
| GO_RIBOSOME_BIOGENESIS | 296 | 0.25070602 | 4.99918 |
| GO_RIBONUCLEOPROTEIN_COMPLEX_BIOGENESIS | 418 | 0.21212487 | 4.848896 |
| GO_NCRNA_PROCESSING | 365 | 0.21557494 | 4.7545476 |
| GO_RRNA_METABOLIC_PROCESS | 247 | 0.25013962 | 4.5609345 |
| GO_NCRNA_METABOLIC_PROCESS | 489 | 0.18218802 | 4.559885 |
| GO_AMIDE_BIOSYNTHETIC_PROCESS | 450 | 0.15983313 | 3.851609 |
| GO_PEPTIDE_METABOLIC_PROCESS | 485 | 0.15072544 | 3.791181 |
| GO_TRANSLATIONAL_INITATION | 141 | 0.2593308 | 3.5440028 |
| GO_PROTEIN_LOCALZATION_TO_ENDOPLASMIC_RETICULUM | 117 | 0.2657012 | 3.2867408 |
| GO_RIBOSOME | 209 | 0.250487 | 4.2095027 |
| GO_RIBOSOMAL_SUBUNIT | 156 | 0.2744567 | 4.0097294 |
| GO_CYtosolic_ribosome | 104 | 0.3145486 | 3.7615237 |
| GO_CYTOSOLIC_PART | 196 | 0.19580589 | 3.2069528 |
| GO_LARGE_RIBOSOMAL_SUBUNIT | 89 | 0.28260428 | 3.1365097 |
| GO_ORGANELLE_INNER_MEMBRANE | 439 | 0.13027835 | 3.0900455 |
| GO_CYTOSOLIC_LARGE_RIBOSOMAL_SUBUNIT | 56 | 0.34957737 | 3.0744233 |
| GO_STRUCTURAL_CONSTITUENT_OF_RIBOSOME | 191 | 0.1942428 | 3.054154 |
| KEGG_RIBOSOME | 85 | 0.3194237 | 3.4482667 |
| REACTOME_3_UTR_MEDIATED_TRANSLATIONAL_REGULATION | 104 | 0.3074383 | 3.7112532 |
| REACTOME_TRANSLATION | 144 | 0.26761383 | 3.7057164 |
| REACTOME_METABOLISM_OF_RNA | 252 | 0.19945833 | 3.6244328 |
| REACTOME_INFLUENZA_VRAL_RNA_TRANSCRIPTION_AND_REPLICATION | 100 | 0.2989483 | 3.5026033 |
| REACTOME_INFLUENZA_LIFE_CYCLE | 134 | 0.25755367 | 3.4797208 |
| REACTOME_PEPTIDE_CHAIN_ELONGATION | 84 | 0.31911618 | 3.4627454 |
| REACTOME_SRP_DEPENDENT_COTRANSLATIONAL_PROTEIN_TARGETING_TO_MEMBRANE | 107 | 0.2777363 | 3.3296747 |
| REACTOME_METABOLISM_OF_MRNA | 207 | 0.19429906 | 3.260686 |
| REACTOME_METABOLISM_OF_PROTEINS | 375 | 0.13962121 | 3.0524178 |
| REACTOME_NONSENSE_MEDIATED_DECAY_ENHANCED_BY_THE_EXON_JUNCTION_COMPLEX | 105 | 0.25953582 | 3.0285935 |
| GO_MITOCHONDRIAL_MATRIX | 363 | 0.13507476 | 2.9350283 |
| REACTOME_INTERFERON_ALPHA_BETA_SIGNALING | 47 | 0.34737128 | 2.8270206 |
| GO_MULTI_ORGANISM_METABOLIC_PROCESS | 136 | 0.23618302 | 3.1626823 |
| GO_MITOCHONDRIAL_MEMBRANE_PART | 149 | 0.19511405 | 2.8355687 |
| GO_HEMOGLOBIN_COMPLEX | 10 | 0.73129374 | 2.795606 |
| GO_ESTABLISHMENT_OF_PROTEIN_LOCALIZATION_TO_ENDOPLASMIC_RETICULUM | 102 | 0.2743921 | 3.1598682 |
| GO_MITOCHONDRIAL_PROTEIN_COMPLEX | 124 | 0.21223837 | 2.781828 |
| GO_MRNA_PROCESSING | 383 | 0.13717589 | 3.0695462 |
| GO_SMALL_RIBOSOMAL_SUBUNIT | 67 | 0.2861866 | 2.7310307 |
| KEGG_OXIDATIVE_PHOSPHORYLATION | 102 | 0.2139487 | 2.5607004 |
| GO_PRERIBOSOME | 58 | 0.30402923 | 2.689826 |
| GO_INNER_MITOCHONDRIAL_MEMBRANE_PROTEIN_COMPLEX | 96 | 0.22972177 | 2.6643124 |
| GO_NUCLEAR_TRANSCRIBED_MRNA_CATABOLIC_PROCESS_NONSENSE_MEDIATED_DECAY | 117 | 0.2404671 | 3.02104 |
| GO_RIBONUCLEOPROTEIN_COMPLEX_SUBUNIT_ORGANIZATION | 182 | 0.19229972 | 3.0143461 |
| GO_OXYGEN_TRANSPORT | 11 | 0.74045074 | 2.9910965 |
| GO_RNA_CATABOLIC_PROCESS | 215 | 0.17328711 | 2.8959625 |
| REACTOME_ACTIVATION_OF_THE_MRNA_UPON_BINDING_OF_THE_CAP_BINDING_COMPLEX_AND_EIFS_AND_SUBSEQUENT_BINDING_TO_43S | 56 | 0.29798278 | 2.624525 |
| KEGG_CYTOKINE_CYTOKINE_RECEPTOR_INTERACTION | 140 | 0.17823075 | 2.427844 |
| GO_SPLICEOSOMAL_COMPLEX | 163 | 0.17006661 | 2.5132518 |
| GO_RNA_SPLICING_VIA_TRANSESTERIIICATION_REACTIONS | 253 | 0.1480691 | 2.785585 |
| GO_RNA_SPLICING | 333 | 0.13281989 | 2.782664 |
| KEGG_PARKINSONS_DISEASE | 97 | 0.20950261 | 2.400622 |
| GO_CYTOSOLIC_SMALL_RIBOSOMAL_SUBUNIT | 43 | 0.3155924 | 2.4801562 |
| GO_VRAL_LIFE_CYCLE | 255 | 0.14622794 | 2.7357216 |
| GO_ESTABLISHMENT_OF_PROTEIN_LOCALIZATION_TO_ORGANELLE | 330 | 0.1289272 | 2.7315574 |
| GO_PROTEIN_CATABOLIC_PROCESS | 489 | 0.107858844 | 2.7223642 |
| GO_NITRIC_OXIDE_METABOLIC_PROCESS | 10 | 0.70486337 | 2.7198806 |

Supplementary Data 12. Enriched gene sets in ETV6/RUNX1 -positive vs high hyperdiploid acute lymphoblastic leukemias based on oligo(dT) RNA-seq data

| Gene set | SIZE | ES | NES | NOM p-val | FDR q-val | FWER p-val | RANK AT MAX LEADING EDGE |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| GO_G_PROTEIN_COUPLED_RECEPTOR_SIGNALING_PATHWAY | 313 | -0.17501 | -3.5808058 | 0 | 0 | 0 | 2157 tags=34\%, list=17\%, signal=40\% |
| GO_DISRUPTION_OF_CELLS_OF_OTHER_ORGANISM | 16 | -0.738571 | -3.5547235 | 0 | 0 | 0 | 1731 tags=88\%, list=14\%, signal=101\% |
| GO_INFLAMMATORY_RESPONSE | 299 | -0.160442 | -3.165028 | 0 | 0 | 0 | 1398 tags=27\%, list=11\%, signal=29\% |
| GO_EXTRACELLULAR_MATRIX | 177 | -0.239577 | -3.7715929 | 0 | 0 | 0 | 2078 tags=40\%, list=16\%, signal=47\% |
| GO_DNA_PACKAGING_COMPLEX | 69 | -0.339398 | -3.2557814 | 0 | 0 | 0 | 3781 tags=64\%, list=30\%, signal=91\% |
| GO_ANCHORED_COMPONENT_OF_MEMBRANE | 69 | -0.31682 | -3.038409 | 0 | 0 | 0 | 1691 tags=45\%, list=13\%, signal=52\% |
| GO_PROTEINACEOUS_EXTRACELLULAR_MATRIX | 134 | -0.220318 | -2.9606977 | 0 | 0 | 0 | 2519 tags=42\%, list=20\%, signal=52\% |
| GO_SIGNALING_RECEPTOR_ACTIVITY | 462 | -0.167844 | -3.9972274 | 0 | 0 | 0 | 1563 tags=29\%, list=12\%, signal=31\% |
| GO_CALCIUM_ION_BINDING | 357 | -0.173327 | -3.7630732 | 0 | 0 | 0 | 2078 tags=33\%, list=16\%, signal=39\% |
| GO_G_PROTEIN_COUPLED_RECEPTOR_ACTIVITY | 157 | -0.224869 | -3.354219 | 0 | 0 | 0 | 1536 tags=34\%, list=12\%, signal=39\% |
| KEGG_SYSTEMIC_LUPUS_ERYTHEMATOSUS | 90 | -0.270521 | -3.0557005 | 0 | 0 | 0 | 3755 tags=57\%, list=30\%, signal= $80 \%$ |
| REACTOME_AMYLOIDS | 49 | -0.417833 | -3.4394717 | 0 | 0 | 0 | 3755 tags=71\%, list=30\%, signal=101\% |
| GO_REGULATION_OF_SYNAPSE_ASSEMBLY | 32 | -0.461889 | -3.1488125 | 0 | $2.41 \mathrm{E}-04$ | 0.001 | 2070 tags=63\%, list=16\%, signal=75\% |
| REACTOME_RNA_POL_I_PROMOTER_OPENING | 40 | -0.428282 | -3.2008202 | 0 | 5.97E-04 | 0.001 | 3755 tags=73\%, list=30\%, signal=103\% |
| REACTOME_GPCR_LIGAND_BINDING | 127 | -0.229186 | $-2.9897523$ | 0 | 3.98E-04 | 0.001 | 2102 tags=39\%, list=17\%, signal=47\% |
| GO_TAXIS | 266 | -0.1637 | -3.0084414 | 0 | 3.86E-04 | 0.002 | 2102 tags=33\%, list=17\%, signal=38\% |
| GO_REGULATION_OF_SYNAPSE_ORGANIZATION | 50 | -0.363144 | $-2.9774964$ | 0 | 6.47E-04 | 0.004 | 3254 tags=62\%, list=26\%, signal=83\% |
| GO_PROTEIN_DNA_COMPLEX | 127 | -0.208275 | -2.707367 | 0 | 0.001696138 | 0.008 | 4941 tags=60\%, list=39\%, signal=97\% |
| REACTOME_MEIOTIC_RECOMBINATION | 58 | -0.306783 | -2.776687 | 0 | 0.002315712 | 0.008 | 3755 tags=60\%, list=30\%, signal= $86 \%$ |
| REACTOME_PACKAGING_OF_TELOMERE_ENDS | 32 | -0.394871 | -2.7068706 | 0 | 0.002538668 | 0.011 | 3699 tags=69\%, list=29\%, signal=97\% |
| GO_CELL_CELL_ADHESION_VIA_PLASMA_MEMBRANE_ADHESION_MOLECULES | 79 | -0.272136 | -2.8705292 | 0 | 0.001945603 | 0.014 | 1856 tags=42\%, list=15\%, signal=49\% |
| REACTOME_MEIOSIS | 82 | -0.252345 | -2.682399 | 0 | 0.002677392 | 0.014 | 3755 tags $=55 \%$, list $=30 \%$, signal= $=78 \%$ |
| GO_NUCLEAR_NUCLEOSOME | 24 | -0.452784 | -2.6364243 | 0 | 0.002646855 | 0.015 | 3755 tags=75\%, list=30\%, signal=107\% |
| REACTOME_CELL_CYCLE | 370 | -0.120322 | -2.6698403 | 0 | 0.00245556 | 0.015 | 8265 tags=77\%, list=66\%, signal=218\% |
| REACTOME_HEMOSTASIS | 343 | -0.126474 | -2.6555524 | 0 | 0.002433309 | 0.017 | 3849 tags=43\%, list=31\%, signal=60\% |
| GO_POSITIVE_REGULATION_OF_SYNAPSE_ASSEMBLY | 25 | -0.476662 | -2.8528705 | 0 | 0.002312046 | 0.019 | 2070 tags=64\%, list=16\%, signal=76\% |
| REACTOME_CLASS_A1_RHODOPSIN_LIKE_RECEPTORS | 92 | -0.233907 | -2.5954976 | 0 | 0.00242138 | 0.019 | 1731 tags=37\%, list=14\%, signal=43\% |
| GO_HEPARIN_BINDING | 62 | -0.274595 | -2.6055458 | 0 | 0.005637264 | 0.025 | 1638 tags=40\%, list=13\%, signal=46\% |
| REACTOME_SIGNALING_BY_GPCR | 271 | -0.13639 | -2.5551717 | 0 | 0.002972317 | 0.026 | 2131 tags=30\%, list=17\%, signal=36\% |
| GO_ANCHORED_COMPONENT_OF_PLASMA_MEMBRANE | 22 | -0.453179 | -2.562505 | 0 | 0.004228907 | 0.027 | 2318 tags=64\%, list=18\%, signal=78\% |
| GO_GLYCOSAMINOGLYCAN_BINDING | 84 | -0.238655 | -2.601601 | 0 | 0.004840542 | 0.027 | 2113 tags=40\%, list=17\%, signal=48\% |
| REACTOME_G2_M_CHECKPOINTS | 41 | -0.34341 | -2.5478773 | 0 | 0.00302334 | 0.028 | 7977 tags=98\%, list=63\%, signal=265\% |
| GO_CELL_CHEMOTAXIS | 97 | -0.237062 | -2.7748 | 0 | 0.003550655 | 0.032 | 2102 tags= $40 \%$, list $=17 \%$, signal $=48 \%$ |
| GO_RECEPTOR_COMPLEX | 188 | -0.156088 | -2.511116 | 0 | 0.004924349 | 0.035 | 1682 tags=29\%, list=13\%, signal=33\% |
| REACTOME_PEPTIDE_LIGAND_BINDING_RECEPTORS | 51 | -0.295201 | -2.4922652 | 0 | 0.004039824 | 0.041 | 1731 tags= $43 \%$, list=14\%, signal=50\% |
| GO_MYELOID_LEUKOCYTE_MIGRATION | 57 | -0.308254 | -2.7479885 | 0 | 0.004351344 | 0.044 | 2102 tags=47\%, list=17\%, signal=57\% |
| GO_REGULATION_OF_SYNAPSE_STRUCTURE_OR_ACTIVITY | 120 | -0.212743 | -2.747738 | 0 | 0.003955768 | 0.044 | 2070 tags $=38 \%$, list $=16 \%$, signal $=44 \%$ |


|  |  |  |  |
| :--- | :--- | :--- | :--- |


 KCNAA，FSHB，ARLLAEP





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$\qquad$

Supplementary Data 15. Genes/proteins close to lost TAD boundaries that displayed significant differences in expression between high hyperdiploid and ETV6/RUNX1 -positive acute lymphoblastic leukemias Too large for printing

| Case | Total number of cells | Average score | Number of cells with score 1 (\%) | Number of cells with score 2 (\%) | Number of cells with score 3 (\%) |
| :---: | :---: | :---: | :---: | :---: | :---: |
| HeH_2 | 23 | 1.6 | 10 (43) | 13 (57) | 0 |
| HeH_3 | 16 | 1.9 | 1 (6) | 15 (94) | 0 |
| HeH_5 | 17 | 1.2 | 14 (82) | 3 (18) | 0 |
| HeH_6 | 11 | 1.9 | 1 (9) | 10 (91) | 0 |
| HeH_7 | 10 | 2 | 0 | 10 (100) | 0 |
| HeH_8 | 24 | 2.2 | 0 | 19 (79) | 5 (21) |
| HeH_9 | 16 | 1.3 | 12 (75) | 4 (25) | 0 |
| HeH_10 | 13 | 2.2 | 0 | 10 (77) | 3 (23) |
| HeH_11 | 6 | 2 | 0 | 6 (100) | 0 |
| HeH_12 | 25 | 2.2 | 0 | 19 (76) | 6 (24) |
| HeH_13 | 24 | 2.1 | 1 (4) | 19 (79) | 4 (17) |
| HeH_14 | 7 | 1.7 | 2 (29) | 5 (71) | 0 |
| HeH_15 | 8 | 1 | 8 (100) | 0 | 0 |
| HeH_16 | 7 | 2 | 0 | 7 (100) | 0 |
| HeH_17 | 18 | 2.3 | 0 | 13 (72) | 5 (28) |
| HeH_19 | 11 | 2 | 3 (27) | 5 (46) | 3 (27) |
| HeH_21 | 4 | 1.5 | 2 (50) | 2 (50) | 0 |
| HeH_22 | 20 | 1.3 | 14 (70) | 6 (30) | 0 |
| HeH_23 | 11 | 1.3 | 8 (73) | 3 (27) | 0 |
| HeH_24 | 15 | 1.4 | 9 (60) | 6 (40) | 0 |
| HeH_25 | 5 | 2 | 0 | 5 (100) | 0 |
| HeH_26 | 11 | 1.7 | 3 (27) | 8 (73) | 0 |
| HeH_27 | 10 | 1.4 | 6 (60) | 4 (40) | 0 |
| HeH_28 | 5 | 1.8 | 1 (20) | 4 (80) | 0 |
| HeH_29 | 13 | 2.2 | 0 | 11 (85) | 2 (15) |
| HeH_30 | 5 | 1.6 | 2 (40) | 3 (60) | 0 |
| HeH_31 | 4 | 1.5 | 2 (50) | 2 (50) | 0 |
| HeH_32 | 4 | 1.3 | 3 (75) | 1 (25) | 0 |
| HeH_33 | 6 | 1.5 | 3 (50) | 3 (50) | 0 |
| HeH_38 | 12 | 1.4 | 7 (59) | 5 (41) | 0 |
| HeH_40 | 9 | 2.3 | 0 | 6 (66) | 3 (34) |
| HeH_42 | 7 | 2.7 | 0 | 2 (29) | 5 (71) |
| HeH_43 | 7 | 2.1 | 1 (14) | 4 (58) | 2 (28) |
| HeH_44 | 9 | 2.2 | 0 | 7 (78) | 2 (22) |
| HeH_45 | 23 | 2.6 | 0 | 10 (48) | 13 (52) |
| HeH_47 | 18 | 1.4 | 11 (61) | 7 (39) | 0 |
| HeH_48 | 29 | 2.8 | 0 | 7 (24) | 22 (76) |
| ETV6/RUNX1_1 | 6 | 2.2 | 1 (17) | 3 (50) | 2 (33) |
| ETV6/RUNX1_3 | 5 | 2.8 | 0 | 1 (20) | 4 (80) |
| ETV6/RUNX1_4 | 17 | 1.4 | 10 (59) | $7(41)$ | 0 |
| ETV6/RUNX1_5 | 31 | 2.1 | 1 (3) | 27 (87) | 3 (10) |
| ETV6/RUNX1_6 | 4 | 2.3 | 0 | 3 (75) | 1 (25) |
| ETV6/RUNX1_7 | 17 | 1.9 | 2 (12) | 15 (88) | 0 |
| ETV6/RUNX1_8 | 27 | 1.7 | 9 (33) | 18 (67) | 0 |
| ETV6/RUNX1_9 | 24 | 2.1 | 0 | 21 (88) | 3 (12) |
| ETV6/RUNX1_10 | 6 | 1.7 | 2 (33) | 4 (67) | 0 |
| ETV6/RUNX1_11 | 25 | 2.8 | 0 | 4 (16) | 21 (84) |
| ETV6/RUNX1_12 | 17 | 1.5 | 8 (47) | 9 (53) | 0 |
| ETV6/RUNX1_13 | 7 | 2 | 0 | 7 (100) | 0 |
| ETV6/RUNX1_14 | 8 | 2.3 | 1 (12) | 4 (50) | 3 (38) |
| ETV6/RUNX1_16 | 8 | 2 | 0 | 8 (100) | 0 |
| ETV6/RUNX1_18 | 20 | 2.1 | 1 (5) | 16 (80) | 3 (15) |
| ETV6/RUNX1_19 | 6 | 2.8 | 0 | 1 (17) | 5 (83) |
| ETV6/RUNX1_20 | 7 | 1.6 | 3 (43) | 4 (58) | 0 |
| ETV6/RUNX1_21 | 11 | 2.4 | 0 | 7 (64) | 4 (36) |
| ETV6/RUNX1_22 | 6 | 2.8 | 0 | 1 (17) | 5 (83) |
| ETV6/RUNX1_23 | 9 | 2.1 | 0 | 8 (88) | 1 (12) |
| ETV6/RUNX1_24 | 16 | 1.8 | 4 (25) | 11 (69) | 1 (6) |
| ETV6/RUNX1_25 | 7 | 2.7 | 0 | 2 (29) | 5 (71) |
| ETV6/RUNX1_27 | 8 | 2.5 | 0 | 4 (50) | 4 (50) |
| ETV6/RUNX1_30 | 25 | 1.6 | 10 (40) | 14 (56) | 1 (4) |
| ETV6/RUNX1_31 | 20 | 1.9 | 2 (10) | 18 (90) | 0 |
| ETV6/RUNX1_33 | 12 | 2 | 1 (8) | 10 (83) | 1 (9) |
| ETV6/RUNX1_34 | 8 | 2.5 | 0 | 4 (50) | 4 (50) |
| ETV6/RUNX1_35 | 21 | 2.1 | 0 | 19 (91) | 2 (9) |
| ETV6/RUNX1_36 | 4 | 2.3 | 0 | 3 (75) | 1 (25) |
| ETV6/RUNX1_38 | 16 | 1.9 | 4 (25) | 10 (63) | 2 (12) |
| ETV6/RUNX1_39 | 5 | 1.6 | 2 (40) | 3 (60) | 0 |
| ETV6/RUNX1_40 | 11 | 1.7 | 3 (28) | 8 (72) | 0 |
| ETV6/RUNX1_41 | 26 | 1.9 | 3 (11) | 23 (89) | 0 |

## Article II

# Sister chromatid cohesion defects are associated with chromosomal copy number heterogeneity in high hyperdiploid childhood acute lymphoblastic leukemia 

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#### Abstract

High hyperdiploid acute lymphoblastic leukemia (ALL) is one of the most common malignancies in children. The main driver event of this disease is a nonrandom aneuploidy consisting of gains of whole chromosomes but without overt evidence of chromosomal instability (CIN). Here, we investigated the frequency and severity of defective sister chromatid cohesion-a phenomenon related to CIN -in primary pediatric ALL. We found that a large proportion (86\%) of hyperdiploid cases displayed aberrant cohesion, frequently severe, to compare with $49 \%$ of ETV6/RUNX1-positive ALL, which mostly displayed mild defects. In hyperdiploid ALL, cohesion defects were associated with increased chromosomal copy number heterogeneity, which could indicate increased CIN. Furthermore, cohesion defects correlated with RAD21 and NCAPG mRNA expression, suggesting a link to reduced cohesin and condensin levels in hyperdiploid ALL. Knockdown of RAD21 in an ALL cell line led to sister chromatid cohesion defects, aberrant mitoses, and increased heterogeneity in chromosomal copy numbers, similar to what was seen in primary hyperdiploid ALL. In summary, our study shows that aberrant sister chromatid cohesion is frequent but heterogeneous in pediatric high hyperdiploid ALL, ranging from mild to very severe defects, and possibly due to low cohesin or condensin levels. Cases with high levels of aberrant chromosome cohesion displayed increased chromosomal copy number heterogeneity, possibly indicative of increased CIN. These abnormalities may play a role in the clonal evolution of hyperdiploid pediatric ALL.


## KEYWORDS

acute lymphoblastic leukemia, aneuploidy, chromosomal instability, hyperdiploidy, sister chromatid cohesion

## 1 | INTRODUCTION

Changes in the number of chromosomes, termed aneuploidy, is one of the most common genetic aberrations in cancer cells. In spite of this,
many questions remain regarding its impact on the cell and its role in tumorigenesis. One such controversial issue is whether aneuploidy is always associated with chromosomal instability (CIN), that is an increased rate of missegregation of chromosomes at mitosis. ${ }^{1}$

[^1]The high hyperdiploid (HeH; 51-67 chromosomes) subgroup of B-cell precursor acute lymphoblastic leukemia (BCP ALL) comprises 25\% to $30 \%$ of all pediatric cases and is associated with young age ( $3-5$ years) at diagnosis and a superior prognosis. ${ }^{2}$ Genetically, HeH leukemia is characterized by a specific aneuploidy, comprising gains of chromosomes X , $4,6,10,14,17,18$ and 21 , which is believed to be the main driver event because it occurs very early in leukemogenesis and is always present in all leukemic cells. ${ }^{3-7}$ In contrast to many other aneuploid malignancies, there is little evidence for CIN in HeH ALL; extra chromosomes are rarely subclonal and the chromosomal pattern generally does not change over the course of the disease. ${ }^{3,6,8,9}$ Thus, HeH ALL appears to be a chromosomally stable aneuploid disease, suggesting that aneuploidy is not necessarily associated with CIN per se. However, underlying CIN that is masked by stable dividing major clones cannot be excluded.

We recently reported that HeH childhood BCP ALL displays relatively low expression of cohesin. ${ }^{10}$ Cohesin is a ring-like multi-protein complex that includes SMC1/SMC3 heterodimers, RAD21, and a STAG1 or STAG2 subunit. ${ }^{11,12}$ One of its main functions is to mediate sister chromatid cohesion at metaphase; a process that, if disrupted, may cause $\mathrm{CIN} .{ }^{1}$ Individuals with constitutional mutations in cohesin components, which cause Cornelia de Lange syndrome, have increased levels of cohesion defects ${ }^{13}$ and knockdown experiments in human cell lines have shown that loss of expression of SMC1A, SMC3, STAG2, and RAD21 are all associated with cohesion defects to different degrees. ${ }^{14-22}$ In cancer, mutations in components of the cohesin complex are recurrent in a wide variety of malignancies, including acute myeloid leukemia, but conflicting results have been reported regarding their link to cohesion defects and aneuploidy. ${ }^{23-27}$ In line with this, a recent study has shown that primary HeH ALL cases present chromatid cohesion defects in addition to delays in early mitosis and chromosome-alignment defects. ${ }^{28}$ The authors found an association between such aberrations and defective condensin complexes, aurora B kinase and the spindle assembly checkpoint ${ }^{28}$ but did not address the possible link with cohesin levels.

In this study, we have investigated the severity and frequency of aberrant sister chromatid cohesion in primary HeH ALL, and how it may affect chromosomal heterogeneity within the HeH subgroup. We found that primary HeH frequently have severe cohesion defects in metaphase chromosomes that are associated with increased chromosomal copy number heterogeneity, indicating that a subset of HeH ALL may possibly harbor CIN. Our data point to a novel opportunity for targeted therapy in HeH ALL, in line with other cancers with cohesion defects.

## 2 | MATERIALS AND METHODS

## 2.1 | Patient samples

Eighty-two childhood ALL cases were included in the study (Supporting Information Table S1), selected on the basis of material being available. Forty-five cases displayed HeH as ascertained by G-banding, fluorescence in situ hybridization (FISH) and/or single nucleotide polymorphism (SNP) array analysis, whereas 37 were ETV6/RUNX1-positive by reverse transcriptase quantitative PCR (RT-PCR) and/or FISH. We have
previously shown that the latter generally display normal levels of cohesin. ${ }^{10}$ Diagnostic samples obtained at ALL diagnosis and stored in fixative (methanol:acetic acid, 3:1) for 1 to 31 years were utilized. Informed consent was obtained according to the Declaration of Helsinki and the study was approved by the Ethics Committee of Lund University. SNP array data from samples obtained at diagnosis were available for all cases except HeH_29 and have been previously published. ${ }^{3,4}$ These data were reanalyzed to identify subclonal chromosome gains using TAPS. ${ }^{29}$ The lower limit of detecting subclonality using this technique was estimated to be approximately $10 \%$ to $20 \%$ of the cells.

## 2.2 | RAD21 knockdown

To investigate the effect of lower levels of cohesin, we performed shRNA-mediated knockdown of RAD21 (RAD21-KD) in the ETV6/RUNX1-positive ALL REH cell line (ACC-22, DSMZ, Braunschweig, Germany) according to methods previously described. ${ }^{26}$ Briefly, lentivirus carrying the shRNA construct and expressing GFP were produced using the human cell line $293 \mathrm{~T}^{26,30}$ REH cells were cultured in standard cell medium (RPMI, 20\% FBS, 1\% P/S) and transduction was done with two different shRNAs targeting RAD21 (RAD21 shRNA-1 and RAD21 shRNA-2, respectively) as well as a non-targeting shRNA control, with three replicates for each. GFP+ cells were sorted by FACS 48 hours posttransduction. Gene expression levels were determined 1 week after transduction by RT-PCR (7500 Real-Time PCR system; Applied Biosystems, Waltham, MS), using probes from Taqman (Life Technologies, Carlsbad, CA) for RAD21 (Hs00366721_mH) and HPRT1 (HsO2800695_m1). Cytogenetic analysis was performed according to standard methods 2 to 3 and immunofluorescence 4 to 5 weeks post-transduction.

## 2.3 | Cohesion assay

Sister chromatid cohesion assay was performed according to Sajesh et al ${ }^{15}$ in the RAD21-KD REH cells and controls (blinded analysis) and in the primary patient samples. For the latter, the analysis was done without prior knowledge of expression levels of members of the cohesin or condensin complexes. FISH or standard G-banding preparations were analyzed using a Z2 fluorescence microscope (Zeiss, Oberkochen, Germany). Images were captured and enhanced using the CytoVision software (Leica, Wetzlar, Germany). Aberrant cohesion was defined as the presence of primary constriction gaps (PCGs), that is, visible gaps between the sister chromatids at the centromeres. ${ }^{15}$ The severity of PCGs was classified based on literature, ${ }^{15}$ with the addition of a fourth category: (a) PCG-I (mild), 1-4 chromosomes with PCGs; (b) PCG-II (moderate) 5-19 chromosomes with PCGs; (c) PCGIII (severe) $\geq 20$ chromosomes with PCGs, but not all; and (d) PCG-IV (very severe), complete loss of cohesion. Since ETV6/RUNX1 is cryptic, leukemic blasts were identified by simultaneous detection of the translocation by FISH or by additional chromosomal aberrations identifiable by chromosome banding. The frequency of cohesion defects in the different subgroups was compared using the Mann-Whitney
$U$ test; $P$-values <. 05 were considered significant. Furthermore, the overall frequency of chromosomes with cohesion defects per patient was calculated taking the number of chromosomes with cohesion defects and dividing it by the total number of chromosomes times the number of analyzed cells. ${ }^{15}$

## 2.4 | Immunoflourescence

The frequency of aberrant mitoses in REH cells under RAD21 knockdown was investigated in a blinded manner using the RAD21-KD cells and controls. Slide preparation was performed according to the guidelines "Cell Staining for Immunofluorescence Microscopy" provided by BD Biosciences (Franklin Lakes, NJ ), with minor modifications. A minimum of 100 mitoses were analyzed for each replicate, and statistical significance was evaluated by the Mann-Whitney $U$ test; $P$-values $<.05$ were considered significant. Primary antibodies anti-tubulin alpha (produced in rabbit, SAB4500087; Sigma-Aldrich, St. Louis MO) and anti-tubulin gamma (produced in mouse, T6557; Sigma-Aldrich) were used to label microtubuli and centrosomes, respectively. Samples were counterstained with anti-rabbit IgG (FITC green, F1262; Sigma-Aldrich) and anti-mouse IgG (Cy3 orange, C2181; Sigma-Aldrich) and slides were mounted with Vectashield medium with DAPI (H-1200; Vector Laboratories, Burlingame, CA).

## 2.5 | Interphase FISH

Interphase FISH was done in a blinded manner on RAD21-KD cells and controls according to standard methods. Slides from each replicate were hybridized with FISH probes for chromosomes X, 2, 3 and 21 (Vysis, Abbott Laboratories, Chicago, IL). A total of 300 nuclei were analyzed for each replicate, with each probe counted separately. Interphase FISH on HeH primary samples was done in a blinded manner in $>300$ nuclei in five cases with high percentage and five cases with low percentage of cohesion defects, all chosen according to availability of material, using probes for chromosomes $\mathrm{X}, 2,3,6,10$, and 21 (Vysis). To minimize technical artefacts, only cases with the same copy number for the analyzed chromosome in the major clone were included in each analysis. To ensure that only leukemic blasts were analyzed, only nuclei where the other probes confirmed hyperdiploidy were included.

## 2.6 | Gene expression correlation

Data from RNA-sequencing were available for 36 of the HeH and 32 ETV6/RUNX1-postive cases (Supporting Information Table S1). ${ }^{31}$ For each cohesin- and condensin-related gene, HeH cases were divided into two groups: high expression and low expression (top and bottom $50 \%$ of cases for the given gene); one-sided Mann-Whitney $U$ test was applied to inquire whether the low expression groups presented higher levels of cohesion defects. Genes included in the analysis were core subunits of the cohesin and condensin complexes, that is,

RAD21, SMC1A, SMC3, STAG1, STAG2 (cohesin), NCAPD2, NCAPD3, NCAPG, NCAPG2, NCAPH, NCAPH2, SMC2 and SMC4 (condensin I and II); $P<.05$ was considered significant.

## 3 RESULTS

## 3.1 | Primary patient samples of HeH ALL have aberrant sister chromatid cohesion

To investigate whether primary ALL samples display cohesion defects, we first ensured that we could detect cohesion defects by analyzing the RAD21-knockdown cells (2 to 2.5 -fold decrease in RAD21 expression; Supporting Information Figure S1). The proportion of mitotic cells displaying cohesion defects was clearly higher in RAD21-knockdown cells: $36 \%$ and $33 \%$, respectively, of two technical replicates vs $4 \%$ of control cells $(P=0.0119$, Mann-Whitney $U$ test; Supporting Information Figure S2A-B and Table S2). RAD21-KD cells also displayed more severe defects, ranging from PCG I-III, while controls presented only PCG I (Supporting Information Table S2). These results are in line with previous reports of cohesin knockdown, ${ }^{14,16}$ and shows that our analysis is able to detect sister chromatid cohesion defects.

Cohesion defects were detected in $86 \%$ of HeH cases vs $49 \%$ of ETV6/RUNX1-positive cases ( $P=3.02 \times 10^{-8}$; Mann-Whitney $U$ test; Figure 1, Supporting Information Table S3). In HeH cases, 0\% to 85\% of the cells displayed cohesion defects (Figure 1E), with mild defects (PCG I) seen in $27 \%$, moderate defects (PCG II) in $40 \%$, and severe defects (PCG III) in $11 \%$ of cases (Figure 1). Complete loss of cohesion was observed in two cells from case $\mathrm{HeH}_{1} 14$ and in one cell each from cases $\mathrm{HeH}_{-} 18$ and $\mathrm{HeH}_{-} 45$ (7\% of cases). In ETV6/RUNX1-positive cases, cohesion defects were seen in $0 \%$ to $18 \%$ of cells, with $30 \%$ of cases classified as mild, $14 \%$ as moderate and $5 \%$ as severe. Complete loss of cohesion was not observed. Taken together, the distribution between the categories (PCG I-PCG IV) clearly differed between the two subtypes (Figure 1F). Furthermore, the frequency of chromosomes displaying cohesion defects per case (based on each case's modal chromosome number) was significantly higher in HeH ALL than in ETV6/ RUNX1-positive ALL $\left(P=4.74 \times 10^{-8}\right.$, Mann-Whitney $U$ test; Supporting Information Table S3). Remission samples from twelve HeH and eight ETV6/RUNX1-positive cases were also analyzed to investigate the frequency of cohesion defects in normal cells. Of 210 analyzed normal cells, only one cell in one remission sample had mild cohesion defects $(0.48 \%)$. Thus, sister chromatid cohesion defects were both significantly more common and more severe in primary HeH as compared with primary ETV6/RUNX1-positive ALL and normal bone marrow cells.

## 3.2 | Cohesion defects are associated with increased chromosomal heterogeneity in primary HeH ALL

Next, we investigated whether cohesion defects lead to increased chromosomal heterogeneity, which is indicative of CIN , in primary

(E)

(F)


FIGURE 1 Analysis of sister chromatid cohesion, detected as primary constriction gaps (PCGs), in primary patient samples from high hyperdiploid and ETV6/RUNX1-positive ALL cases. A, Metaphase from case $\mathrm{HeH}_{2} 3$, classified as PCG I, where two chromosomes (arrows) displayed cohesion defects; B, metaphase from case HeH_40, classified as PCG II, where seven chromosomes (arrows) displayed cohesion defects; C, metaphase from case HeH_26, classified as PCG III, where 22 chromosomes (arrows) displayed cohesion defects; D, metaphase from case HeH_14, classified as PCG IV, that is, complete loss of cohesion. E, Incidence of cohesion defects, comparing high hyperdiploid and ETV6/RUNX1-positive ALL cases: cohesion defects, shown as percentage of total cells presenting PCGs per case, where the boxes show the interquartile range and median (line) values, whiskers show minimum and maximum values in the cohort and outliers are shown as circles; F , classification of ETV6/RUNX1-positive and high hyperdiploid cases according to the cohesion assay criteria, from "no PCG" to "PCG I-IV"

ALL by interphase-FISH. There was an increase in copy number variation for all the six assessed chromosomes in cases with high levels of cohesion defects, being statistically significant for chromosomes 3,6 , 10 and $21(P=.0357, P=.00794, P=.0286$, and $P=.0179$, respectively; Figure 2, Supporting Information Table S4). Thus, sister chromatid cohesion defects were associated with increased chromosomal copy number heterogeneity in HeH ALL, indicating that cohesion defects may lead to increased CIN.

To investigate whether sister chromatid cohesion defects were also associated with the number of subclones involving whole chromosomes in primary HeH ALL, SNP array data was analyzed in 44 of the HeH cases. Subclonality was detected for 1 to 4 chromosomes in 18 cases ( $40 \%$ ). No difference in the frequency of cohesion defects was seen between cases with and without subclonal chromosome changes ( $P=.747$; Mann-Whitney $U$ test).

## 3.3 | Cohesion defects are associated with decreased RAD21 and NCAPG expression in primary HeH ALL

To investigate whether sister chromatid cohesion defects could be linked to cohesin or condensin levels, we analyzed whether mRNA expression of core subunits from both protein complexes correlated with the percentage of cells displaying cohesion defects. Consistent with our hypothesis, the expression of RAD21 was negatively correlated with the number of cells displaying cohesion defects in HeH ALL ( $P=.00111$; one-sided Mann-Whitney $U$ test; Supporting Information Figure S3C). Moreover, low NCAPG levels also correlated with aberrant cohesion ( $P=.00424$; one-sided Mann-Whitney $U$ test; Supporting Information Figure S4C). No other correlations were seen in the HeH cases only (Supporting Information Figure S3, Supporting Information Figure S4), the ETV6/RUNX1-positive cases only, or in both groups combined.

## 3.4 | Knockdown of RAD21 leads to increased chromosomal heterogeneity and aberrant mitoses in leukemic cells

To assess further whether the low levels of cohesin affect chromosomal stability in hematopoietic cells, we performed interphase FISH in the RAD21-KD cells. For all four investigated chromosomes, RAD21-KD cells displayed increased variation in copy number; however, it was only statistically significant for chromosome 21 (Figure 3, Supporting Information Table S5). Taken together, the interphase FISH showed increased chromosomal heterogeneity in RAD21-KD cells, indicating that decreased levels of cohesin lead to increased CIN.

Next, we investigated whether low expression of RAD21 affects cell division in ALL cells by analyzing for spindle defects-monopolar, tripolar, and tetrapolar mitoses-and chromatin bridges/lagging


FIGURE 2 Copy number in HeH ALL primary patient cells with high PCG (primary constriction gaps) (HeH_4, HeH_14, HeH_18, HeH_40 and HeH_41) and low PCG ( $\mathrm{HeH}_{-} 21, \mathrm{HeH}_{-} 23, \mathrm{HeH}_{-} 30, \mathrm{HeH}_{-} 39$ and $\mathrm{HeH}_{-} 42$ ), analyzed by interphase fluorescence in situ hybridization for chromosomes $\mathrm{X}, 2,3,6,10$ and 21 . A, Overall copy number of chromosome X , disomy expected; B, overall copy number of chromosome 2, disomy expected; C, overall copy number of chromosome 3, disomy expected; D, overall copy number of chromosome 6, trisomy expected; E, overall copy number of chromosome 10, trisomy expected; F, overall copy number of chromosome 21, tetrasomy expected; G, nucleus from HeH_42, showing disomy of chromosome X, disomy 3 and trisomy 10 ; H, nucleus from HeH_14, showing disomy X, monosomy 3 and trisomy 10 ; I, nucleus from $\mathrm{HeH}_{-} 40$, showing trisomy $X$, disomy 3 and trisomy 10 ; J, nucleus from $\mathrm{HeH}_{-} 14$, showing disomy $X$, trisomy 3 and trisomy 10; K, nucleus from HeH_14, showing monosomy 2,trisomy 6 and disomy 10; L, nucleus from HeH_41, showing trisomy 2, trisomy 6 and trisomy 10; M , nucleus from $\mathrm{HeH}_{-} 30$, showing disomy 2, tetrasomy 6 and trisomy 10; N, nucleus from $\mathrm{HeH}_{-} 30$, showing disomy 2, trisomy 6 and tetrasomy 10; O, nucleus from HeH_18, showing disomy 6, two copies of ETV6 (chromosome 12) and four copies of RUNX1 (chromosome 21); P, nucleus from HeH_40, showing tetrasomy 6, two copies of ETV6 and five copies of RUNX1; Q, nucleus from HeH_18, showing trisomy 6, three copies of chromosome ETV6 and five copies of RUNX1; R, nucleus from HeH_40, showing trisomy 6, two copies of ETV6 and three copies of RUNX1
chromosomes (Supporting Information Figure S2C-F, Table S6). The overall frequency of mitotic aberrations in RAD21-KD cells was 6.5\%, while no control cells had such aberrations ( $P=.0119$, Mann-Whitney $U$ test; Supporting Information Figure S2G). Spindle defects were detected in $4.8 \%$ of RAD21-KD cells; in particular, tripolar mitoses
were more frequent ( $P=.0119$; Mann-Whitney $U$ test). Chromatin bridges/lagging chromosomes were only seen in RAD21-KD cells (1.6\% of the cells). Taken together, lower expression of RAD21 increased the frequency of spindle defects, in particular tripolar mitoses.

FIGURE 3 Copy number in REH cells with low expression of RAD21 (RAD21-KD cells) and controls, analyzed by interphase fluorescence in situ hybridization for chromosomes $\mathrm{X}, 2,3$ and 21. A, Overall copy number of chromosome X , monosomy expected; B , overall copy number of chromosome 21, trisomy expected; C , nucleus from replicate RAD21.1-3, showing one copy of chromosome $X$ and two copies of chromosome 21; D, nucleus from replicate RAD21.2-3, showing two copies of chromosome $X$ and three copies of chromosome 21; E, nucleus from replicate RAD21.2-2, showing one copy of chromosome $X$ and four copies of chromosome 21; $F$, nucleus from replicate RAD21.1-3, showing one copy of chromosome $X$ and five copies of chromosome 21 ; G , overall copy number of chromosome 2 , disomy expected; H , overall copy number of chromosome 3 , disomy expected; I, nucleus from replicate RAD21.2-4, showing two copies of chromosome 2 and one copy of chromosome 3; J, nucleus from replicate RAD21.2-5, showing one copy of chromosome 2 and three copies of chromosome 3 ; K, nucleus from replicate control 5 , showing two copies of chromosome 2 and three copies of chromosome 3 ; L , nucleus from replicate control 5 , showing two copies of chromosome 2 and two copies of chromosome 3

## Copy No. 12345

(A) $\quad \begin{aligned} & 12345 \\ & X\end{aligned}$


(B)

Chromosome 21

(H)


CEP X
TEL 21q


TEL 2p CEP

(L)


## 4 | DISCUSSION

In this study, we found that HeH ALL cells frequently harbor aberrant cohesion, in line with the recent investigation by Molina et al. ${ }^{28}$ In a further expansion of their findings, we report that the incidence and severity of defects vary within the subgroup. HeH ALL displayed both a higher frequency and more severe cohesion defects compared to ETV6/RUNX1-positive cases. Notably, the percentage of aberrant cohesion ranged from $0 \%$ to $85 \%$ in primary HeH ALL, where $40 \%$ of the cases presented moderate and $18 \%$ presented severe or very severe cohesion defects, showing that aberrant sister chromatid cohesion is a widespread, yet heterogeneous, phenomenon in HeH childhood ALL.

Sister chromatid cohesion defects may be associated with CIN, which in turn may give rise to increased heterogeneity in chromosomal copy numbers. Whether HeH ALL display CIN or not is a controversial issue. Some investigators have reported widespread chromosomal heterogeneity when using interphase FISH to analyze
commonly gained chromosomes. ${ }^{28,32-34}$ However, a major problem with these studies is that they have compared HeH samples containing trisomies with normal or other BCP ALL samples containing disomies. Since the baseline number of the chromosomes differ between these two groups, appropriate cut-off levels for the probes cannot be determined and solid data are thus lacking. Here, we circumvented this problem by comparing two groups of HeH cases, only including cases with the same copy number for the analyzed chromosomes. We detected a clear difference between cases with high levels of sister chromatid cohesion defects and those with low levels/no cohesion defects. Thus, we can conclude that aberrant sister chromatid cohesion result in increased levels of chromosomal copy number heterogeneity. Although the link between chromosomal copy number heterogeneity and CIN is not absolute, these findings suggest that cohesion defects are associated with increased CIN. However, this did not translate into an increased number of subclones detectable by SNP array analysis in cases with high levels of cohesion defects, likely due to the lower limit of detection of subclonal trisomies with this
method being approximately 10-20\%, preventing detection of smaller subclones. Molina et $\mathrm{al}^{28}$ reported that inhibition of AURKB, suggested to be the functional outcome of defective condensin in their study, in CD34-positive hematopoietic stem/progenitor cells led to an increase in the number of hyperdiploid cells, although no further characterization of the exact chromosomal content of these cells was done. However, considering that we show that not all HeH cases display cohesion defects, regardless of the underlying cause, it does seem unlikely that these are directly causative of the aneuploidy, in particular as the allelic patterns in HeH ALL suggest that the majority of extra chromosomes are gained in one abnormal cell division. ${ }^{35-37}$ Rather, sister chromatid cohesion defects may promote clonal evolution in HeH ALL through increased chromosomal heterogeneity. Taken together, since the incidence of cohesion defects as well as the level of chromosomal heterogeneity varies among HeH cases, these phenomena are likely not early events in leukemogenesis, but could rather have a role in later optimization of the chromosomal gains once the initial hyperdiploidy has been established.

We recently reported that HeH ALL display low levels of cohesin compared to ETV6/RUNX1-positive cases and normal BCP cells. ${ }^{10}$ This was shown on the protein level as well in multiple mRNA datasets and impacted the overall gene expression. Since low cohesin levels would be expected to also result in aberrant cohesion, we investigated whether the cohesion defects described here in primary HeH ALL correlated with the expression of cohesin subunits in HeH ALL. We found a negative correlation between RAD21 mRNA expression and the incidence of cohesion defects, in agreement with prior in vitro studies, ${ }^{14,15}$ whereas no statistically significant correlation was seen for the remaining genes. Another recent study investigated the incidence of mitotic and chromosomal defects in HeH ALL compared to other B-ALL subgroups, suggesting that impairment of aurora $B$ kinase and the condensin complex were underlying such abnormalities. ${ }^{28}$ Although the authors observed no correlation at the mRNA expression level of condensin, suggesting that posttranslational modifications were likely to be the cause of condensin impairment, we here found that NCAPG mRNA expression correlates with cohesion defects within the HeH ALL subgroup. Taken together, we cannot definitely state whether dysregulation of cohesin, condensin, or a combination of both causes cohesion defects in primary ALL.

There are conflicting data in the literature on the link between cohesin dysregulation and aneuploidy. Solomon et al ${ }^{18,25}$ reported increased variability in chromosome numbers in cell lines with knockdown of STAG2, whereas Balbás-Martínez et al ${ }^{38}$ did not observe such effects. Using interphase FISH, we detected increased chromosomal heterogeneity for chromosome 21, the only investigated trisomy, in REH leukemic cells with knockdown of RAD21, but not for chromosomes $\mathrm{X}, 2$ and 3 . Whether this discrepancy is due to an underlying chromosome-specific effect-as recently shown to exist for certain CIN -associated phenomena ${ }^{39}$-or to the fact that more copy number variation can be expected for trisomic chromosomes, simply because there are more copies that can be affected, remain to be investigated. Taken together, our data support that low expression
of RAD21 compromises the integrity of chromosome segregation in BCP ALL cells, at least for some chromosomes.

Recent studies have suggested possible agents for targeted therapy in cohesion-defective cancers, based on synthetic lethality experiments in cells with aberrant cohesion. In particular, inhibition of the anaphase promoting complex in the presence of aberrant cohesion has been shown to have synthetic lethality, leading to mitotic death. ${ }^{40}$ Furthermore, synthetic lethality has been described for cohesin defects and poly-ADP ribose polymerases (PARP)-a protein involved in double-stranded DNA repair-where cell lines under siRNAmediated depletion of SMC1, SMC3 or RAD21 showed increased sensitivity to the PARP-inhibitor olaparib. ${ }^{41}$ Thus, considering our data showing that primary samples have cohesion defects, such treatments could be a possible future option in at least a subset of HeH ALL.

## CONFLICT OF INTEREST

The authors declare no potential conflicts of interest.

## DATA AVAILABILITY STATEMENT

The RNA dataset used in this study is available at the European Genomephenome archive under accession number EGAD00001002112. SNP array data are not publicly available due to privacy concerns but are available from the corresponding author on reasonable request.

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## SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section at the end of this article.

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## Supporting Information

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RAD21 expression


Supporting Information Fig. 1. RAD21 expression in REH cells submitted to knockdown (RAD21.1 replicates 1-6, RAD21.2 replicates 1-6) and REH control cells (Control 1-6), measured as relative quantification by qPCR, where the expression of the gene of interest is compared to expression of a reference gene (HPRT1 in the present study). Calculations were performed using the comparative $C t$ method (i.e., $\Delta \Delta C t$ ) and standard deviation was calculated from the three replicates of each sample (whiskers). RAD21 against HPRT1 expression in each replicate.


Supporting Information Fig. 2. Cohesion defects and aberrant mitoses in cells with knockdown of RAD21. (A-B) Examples of sister chromatid cohesion detected as number of primary constriction gaps (PCGs) (primary in REH cells with low expression of RAD21 (RAD21-KD cells) and controls. (A) Metaphase with normal chromosome cohesion from replicate Control 2; (B) metaphase classified as PCG II from replicate RAD21.2-2. (C-F) Examples of aberrant mitoses detected by immunofluorescence microscopy on RAD21-KD cells and Control cells; microtubuli structures were stained for $\alpha$-Tubulin (green - FITC), centrosomes were stained for $\gamma$ Tubulin (orange - Cy3) and DNA was stained with DAPI. (C) Monopolar mitosis in replicate RAD21.1-6; (D) tripolar mitosis in replicate RAD21.1-6; (E) tetrapolar mitosis in replicate RAD21.1-4; (F) chromatin bridge/lagging chromosomes (arrow) during mitosis in replicate RAD21.2-4. (G) Fraction of cells with aberrant mitoses in RAD21-KD and Control cells.


Supporting Information Fig. 3. mRNA expression of cohesin-related genes in relation to number of cells with cohesion defects, measured as percentage of cells with primary constriction gaps (PCGs), in high hyperdiploid ALL cases. (A) SMC1A, (B) SMC3, (C) RAD21, (D) STAG1 and (E) STAG2. Boxes show the interquartile range and median (line) values, whiskers show minimum and maximum values in the cohort and dots show cases individually. Whether low mRNA expression was associated with more PCGs were investigated with the onesided Mann-Whitney U test. RAD21 showed statistically significant association $(P<0.05)$ with the number of cells with PCGs.


Supporting Information Fig. 4. mRNA expression of condensin-related genes in relation to number of cells with cohesion defects, measured as percentage of cells with primary constriction gaps (PCGs), in high hyperdiploid ALL cases. (A) NCAPD2, (B) NCAPD3, (C) NCAPG, (D) NCAPG2, (E) NCAPH, (F) NCAPH2, (G) SMC2 and (H) SMC4. Boxes show the interquartile range and median (line) values, whiskers show minimum and maximum values in the cohort and dots show cases individually. Whether low mRNA expression was associated with more PCGs were investigated with the one-sided Mann-Whitney U test. NCAPG showed statistically significant association ( $P<0.05$ ) with the number of cells with PCGs.

Supporting Information Table 1. Gender, age at diagnosis, karyotype information and RNA-seq for 82 primary acute lymphoblastic leukemia.

| Case | Gender | Age | Karyotype | RNA-seq |
| :---: | :---: | :---: | :---: | :---: |
| HeH_1 | M | 2 | 56,XY,+X,+Y,+4,t(75;9)(q?;p13-21),+6,+10,+14,+17,+18,+21,+22 | yes |
| HeH_2 | F | 16 | $60, \mathrm{XX},+\mathrm{X},+4,+5,+6,+7,+8,+10,+14,+14,+17,+18,+21,+21,+21$ | yes |
| HeH_3 | F | 6 | $53, \mathrm{XX},+\mathrm{X},+4,+6,+14,+17,+21,+21$ | yes |
| HeH_4 | F | 11 | $57, \mathrm{XX},+\mathrm{X},+6,+10,+10,+\mathrm{add}(14)(\mathrm{p} 1 ?),+15,+17,+18,+21,+21,+$ mar,inc | yes |
| HeH_5 | F | 8 | 59,XX, +X,+X,+4,+6,+9,+10,+10,+14,+15,idic(17)(p11),+18,+20,+21,+21100 | yes |
| HeH_6 | F | 4 | $54, \mathrm{XX},+\mathrm{X},+4,+6,+14,+17,+18, \operatorname{der}(19) \mathrm{t}(18 ; 19)(\mathrm{q} 22.3 ; \mathrm{p} 13.3),+21,+21$ | yes |
| HeH_7 | F | 15 | 57,XX, +X, +X, +4,+6, $\operatorname{der}(8) \mathrm{t}(8 ; 14)(\mathrm{p} 11 ; \mathrm{q} 12),+10,+14,+14,+17,+18,+21,+21$ | yes |
| HeH_8 | F | 2 | $53, \mathrm{XX},+\mathrm{X},+8,+14,+15,+17,+21,+21$ | yes |
| HeH_9 | M | 2 | $56, \mathrm{XY},+\mathrm{X},+4,+6,+10,+14,+17,+18, ?+\operatorname{der}(19) \mathrm{t}(1 ; 19)(\mathrm{q} 11 ; \mathrm{p} 13),+21,+21$ | yes |
| HeH_10 | M | 5 | $55, \mathrm{XY},+\mathrm{X},+6,+9,+14,+14,+17,+18,+21,+21$ | yes |
| HeH_11 | M | 3 | 60-63,XY,inc/46,XY | no |
| HeH_12 | F | 2 | $56, \mathrm{XX},+\mathrm{X},+4,+6,+8,+10,+14,+17,+18,+21,+21$ | yes |
| HeH_13 | F | 3 | $57, \mathrm{XX},+\mathrm{X},+4,+6,+8,+8,+12,+14,+17,+18,+21,+21 / 58$, idem,+10 | yes |
| HeH_14 | M | 3 | 56, XY, +X, der(1)?ins(1;?)(q21;?),+4,+6, +8, +10,+14,+17,+18,+21,+21 | no |
| HeH_15 | M | 3 | $55, \mathrm{XY},+\mathrm{X},+4,+5,+6, \mathrm{idic}(7)(\mathrm{p} 11),+8,+10,+14,+17,+21$ | yes |
| HeH_16 | M | 7 | $56, \mathrm{XY},+\mathrm{X},+4,+6,+10,+14,+14,+\operatorname{der}(17) \mathrm{t}(3 ; 17)(\mathrm{q} 21 ; \mathrm{p} 11.1),+18,+18,+21$ | yes |
| HeH_17 | M | 3 | $54, \mathrm{XY},+\mathrm{X},+4,+6,+10,+14,+17,+18,+21$ | yes |
| HeH_18 | M | 3 | $52, \mathrm{XY},+\mathrm{X}, \operatorname{dup}(1)(\mathrm{q} 21 \mathrm{q} 42),+6,+10,+11,+21,+21$ | yes |
| HeH_19 | M | 12 | $52-53, \mathrm{XY},+6,+? 14,+18,+21,+22$, inc $/ 46, \mathrm{XY}$ | no |
| HeH_20 | F | 1 | $54, \mathrm{XX},+\mathrm{X},+6,+8,+14,+17,+18,+21,+21$ | yes |
| HeH_21 | M | 7 | $52-59, X Y,+X,+4,+5,+6,+8,+10,+10, \operatorname{der}(13 ; 14)(\mathrm{q} 10 ; \mathrm{q} 10) \mathrm{c},+14,+17,+18,+18,+20,+21,+22$ | yes |
| HeH_22 | F | 3 | $52-56, \mathrm{XX}, \mathrm{add}(1)(\mathrm{q} 3 ?),+6,+21,+21$, inc | no |
| HeH_23 | M | 2 | $63, \mathrm{XY},+\mathrm{X},+\mathrm{Y},+4,+\operatorname{der}(5) \mathrm{t}(1 ; 5)(\mathrm{q} 12 ; \mathrm{q} 21),+6,+8,+9,+10,+11,+12,+14,+14,+17,+18,+21,+21,+22$ | yes |
| HeH_24 | M | 4 | $61, \mathrm{XX},-\mathrm{Y},+3,+4,+5,+6,+8,+10,+10,+13,+14,+14,+17,+18,+18,+21,+21$ | yes |
| HeH_25 | M | 2 | $54, \mathrm{XY},+\mathrm{X},+4,+6,+10,+14,+17,+18,+21 / 55$, idem,+21 | yes |
|  |  |  | $55, \mathrm{XY},+\mathrm{X}, \mathrm{t}(2 ; 8)(\mathrm{p} 11.2 ; \mathrm{q} 21.13),+4,+6,+10,+14,+\operatorname{der}(17) \mathrm{t}(17 ; 19)(\mathrm{q} ? ; ?) \mathrm{del}(17)(\mathrm{p} 11 \mathrm{p} 13),+18$, | yes |
| HeH_26 | M | 13 | $\operatorname{der}(19) \mathrm{t}(17 ; 19),+21,+21$ |  |
| HeH_27 | M | 2 | $57, \mathrm{XY},+\mathrm{X},+\mathrm{Y},+4,+6,+10,+14,+17,+18,+21,+21,+$ mar | yes |
| HeH_28 | M | 6 | $57-58, \mathrm{XY},+\mathrm{X},+4,+6,+9,+10,+14,+17,+18,+18,+21,+21$ | yes |
| HeH_29 | F | 5 | $54, \mathrm{XX},+\mathrm{X},+4,+6, \operatorname{del}(6)(\mathrm{q} 16),+14,+17,+18,+21,+21 / 56$, idem $,+8,+10$ | no |
| HeH_30 | M | 4 | $56, \mathrm{XY},+\mathrm{X},+3,+4,+6,+8,+10,+14,+16,+18,+21 / 56, \mathrm{idem}, \mathrm{i}(7)(\mathrm{q} 10)$ | yes |
| HeH_31 | M | 3 | $57, \mathrm{XY},+\mathrm{X},+\mathrm{Y},+4,+5,+6,+10,+14,+17,+21,+21,+21$ | yes |
| HeH_32 | F | 3 | $53, \mathrm{XX},+\mathrm{X},+6,+10,+11,+18,+18,+21 / 54$, idem,+8 | yes |
| HeH_33 | F | 4 | 54-57,XX, +X, +X, +4, +5,+6, $\operatorname{der}(36) t(1 ; 6)(\mathrm{q} 21 ; \mathrm{p} 25),+10,+14, \mathrm{i}(17)(\mathrm{q} 10),+18,+21,+21$ | yes |


| HeH_34 | M | 9 | ??,?X, $+8[9.2 \%],+8[10.2 \%],+21[13.7 \%],+21[11.7 \%]$ (FISH-based) | no |
| :---: | :---: | :---: | :---: | :---: |
| HeH_35 | F | 3 | $55, \mathrm{XX},+\mathrm{X},+4,+6,+7,+10,+14,+17,+18,+21$ | yes |
| HeH_36 | M | 5 | $57, \mathrm{XY},+\mathrm{X},+4,+5,+6,+9,+10,+14,+\operatorname{der}(16) \mathrm{t}(11 ; 16)(\mathrm{p} 11.2 ; \mathrm{p} 11.2),+18,+21,+21$ | yes |
| HeH_37 | F | 4 | 52,XX,+X,+6,+14,+17,+18,+21/53,idem, +21 | yes |
|  |  |  | $62, \mathrm{XY},+\mathrm{X},-\mathrm{Y}, \mathrm{t}(\mathrm{X} ; 4)(\mathrm{q} 28 ; \mathrm{q} 35.2) \mathrm{t}(2 ; 19)(\mathrm{p} 11.2 ; \mathrm{q} 13.32),+4,+5,+6,+7,+10,+11,+12,+14,+14,+16$, | yes |
| HeH_38 | M | 1 | $+\operatorname{der}(17) \mathrm{t}(4 ; 17)(\mathrm{q} 26 ; \mathrm{q} 22),+18,+21,+21,+21,+22$ |  |
| HeH_39 | M | 3 | $56, \mathrm{XY},+\mathrm{X},+4,+6,+8,+10,+14,+17,+18,+21,+21$ | no |
| HeH_40 | F | 4 | $54, \mathrm{XX},+\mathrm{X},+4,+6,+10,+17,+18,+21,+21$ | yes |
| HeH_41 | M | 8 | 54,XY,+X,+4,+6,+8,+10,+18,+21,+21 | no |
| HeH_42 | M | 10 | $54, \mathrm{XY},+\mathrm{X},+6,+10,+14,+17,+18,+21,+21$ | yes |
| HeH_43 | F | 4 | $52-55, \mathrm{XX},+6,+10,+10,+14,+14,+18,+21,+21[9] / 46, \mathrm{XX}[1]$ | no |
| HeH_44 | M | 3 | $55, \mathrm{XY},+\mathrm{X}$, dup(1)(q12q25), $+4,+6,+10,+14,+17,+18,+21,+21$ | yes |
| HeH_45 | M | 3 | $50-56, \mathrm{XY},+\mathrm{X},+4,+6,+14,+17,+18,+\operatorname{add}(21)(\mathrm{q}$ ? $),+\operatorname{der}(?) \mathrm{t}(? ; 21)$, inc | yes |
|  |  |  | 46,XY, del (2)(p11), add(3)(p11), add(6)(q21), add(12)(p13), der(12)t(12;21)(p13;q22), ider(21) | yes |
| ETV6/RUNX1_1 | M | 4 | $(\mathrm{q} 10) \mathrm{t}(12 ; 21),+2-3 \mathrm{mar}, \mathrm{inc}$ |  |
|  |  |  | $46, \mathrm{X}$ ? $\mathrm{X},-5, \operatorname{add}(7)(\mathrm{q} 31), \operatorname{add}(12)(\mathrm{p} 11) \mathrm{t}(12: 21)(\mathrm{p} 13 ; \mathrm{q} 22),-13,-13, ? \operatorname{der}(21 ; 21)(\mathrm{q} 10 ; \mathrm{q} 10),+21$, | yes |
| ETV6/RUNX1_2 | F | 7 | $+2-3 \mathrm{mar}$ |  |
| ETV6/RUNX1_3 | M | 5 | 46,XY,t(12;21)(p13;q22)/47,idem,+16/47,idem, $\operatorname{der}(6) \mathrm{t}(\mathrm{X} ; 6)(? ; \mathrm{q} 1$ ? $),+16$ | yes |
| ETV6/RUNX1_4 | F | 3 | 46,XX,t(12;21)(p13;q22) | yes |
| ETV6/RUNX1_5 | M | 3 | ??,X?,t(12;21)(p13;q22),+der(?)t(?;21)(?;q?)/??,X?,t(12;21),+21,+der(?)t(?;12)t(12;21) | yes |
|  |  |  | $? ?, \mathrm{X},-\mathrm{X},+4,+4,+6,+6,+8,+8,+10,+10, \mathrm{t}(12 ; 21)(\mathrm{p} 13 ; \mathrm{q} 22) \times 12,+14,+14,+17,+17,+18,+18,+21$, | yes |
| ETV6/RUNX1_6 | F | 10 | +21,+21 |  |
| ETV6/RUNX1_7 | F | 7 | 46,XX, $\mathrm{t}(12 ; 21)(\mathrm{p} 13 ; \mathrm{q} 22)$ | yes |
| ETV6/RUNX1_8 | M | 10 | 47,XY, +X,t(12;21)(p13;q22) | yes |
| ETV6/RUNX1_9 | M | 6 | 46,XY,t(12;21)(p13;q22) | no |
| ETV6/RUNX1_10 | F | 10 | ??,?X, del(12)(p13p13),t(12;21)(p13q22)[23.5\%]/??,?X[68.0\%] | no |
| ETV6/RUNX1_11 | F | 3 | ??,X?, del(12)(p13p13),t(12;21)(p13;q22) | yes |
| ETV6/EUNX1_12 | M | 6 | ??,X?,t(12;21)(p13;q22),+der(21)t(12;21) | yes |
| ETV6/RUNX1_13 | F | 3 | 48,XX, t(12;21)(p13;q22),+21,+22/48,idem, $\operatorname{del}(6)(\mathrm{q} 21 \mathrm{q} 2 ? 5)$ | yes |
| ETV6/RUNX1_14 | F | 5 | $45, \mathrm{XX}, \mathrm{add}(6)(\mathrm{q} 15), \mathrm{del}(12)(\mathrm{p} 11), \mathrm{t}(12 ; 21)(\mathrm{p} 13 ; \mathrm{q} 22),-13, \mathrm{add}(15)(\mathrm{q} 22)$ | yes |
| ETV6/RUNX1_15 | M | 3 | ??,?X,t(12:21)(p13;q22),+der(21)t(12:21)(p13;q22) | yes |
| ETV6/RUNX1_16 | M | 6 | 46,XY,t(12;21)(p13;q22) | yes |
| ETV6/RUNX1_17 | F | 6 | ??,XX,t(12;21)(p13;q22),inc | yes |
| ETV6/RUNX1_18 | M | 5 | 46,XY, dup $(\mathrm{X})(\mathrm{q} 25 \mathrm{q} 28), \mathrm{t}(12 ; 21)(\mathrm{p} 13 ; \mathrm{q} 22), \operatorname{add}(16)(\mathrm{q} 21)$ | yes |
| ETV6/RUNX1_19 | M | 3 | 46, XY, del(12)(p13p13),t(12;21)(p13;q22)/47,idem, $+\operatorname{der}(21) \mathrm{t}(12 ; 21)$ | yes |
| ETV6/RUNX1_20 | F | 4 | 46, XX, del(12)(p12p13),t(12;21)(p13;q22) | yes |
|  |  |  | $46-47, X X, \operatorname{der}(2) t(2 ; 5)(\mathrm{p} 13 ; \mathrm{q} 13), \operatorname{del}(4)(\mathrm{q} 11), \operatorname{del}(5)(\mathrm{q} 13), \operatorname{der}(6) \mathrm{t}(2 ; 6)(\mathrm{p} 13 ; \mathrm{p} 22),-9, \operatorname{del}(12)(\mathrm{p} 11)$ |  |
| ETV6/RUNX1_21 | F | 3 | $\operatorname{der}(12) \mathrm{t}(4 ; 12)(\mathrm{q} 11 ; \mathrm{p} 12), ? \operatorname{add}(13)$ | yes |


|  |  |  | $52, \mathrm{XY},+\mathrm{X},+4, \operatorname{der}(6) \mathrm{t}(6 ; 12)(\mathrm{p} 192 ; \mathrm{q} 15), \operatorname{add}(8)(\mathrm{p} ? 21),+9,+10, \operatorname{del}(12)(\mathrm{q} 15), \mathrm{der}(12) \mathrm{t}(6 ; 12)$ | yes |
| :---: | :---: | :---: | :---: | :---: |
| ETV6/RUNX1_22 | M | 0 | (p122;p13), ins(12;21)(p13;q22),+der(21)t(12;21)(p13;q22) |  |
| ETV6/RUNX1_23 | M | 6 | 46,XY,del(12)(p13p13)t(12:21)(p13;q22) | yes |
| ETV6/RUNX1_24 | M | 4 | ??,X? L (12; 21)(p13;q22) | yes |
| ETV6/RUNX1_25 | M | 1 | 46,XY,t(12;21)(p13;q22) | yes |
| ETV6/RUNX1_26 | M | 5 | 46,XY,del(12)(p11),t(12;21)(p13;q22)/46,XY | no |
| ETV6/RUNX1_27 | M | 2 | 47-48, XY, $\operatorname{add}$ (12)(p11),t(12;21)(p13;q22),+21 | yes |
| ETV6/RUNX1_28 | M | 4 | 46,XY,del(12)(p13p13),t(12;21)(p13;q22) | no |
| ETV6/RUNX1_29 | M | 3 | 46,XY, ?add(7)(p21),t(12:21)(p13;q22),del(12)(p13p13),add(15)(q21),add(22)(q13) | yes |
| ETV6/RUNX1_30 | M | 6 | 45-46, XY, $\operatorname{del}(6)(\mathrm{q}$ ? ), add(12)(p11),t(12;21)(p13;q22),inc | yes |
|  |  |  | 47,XY,dup(5)(p12p15),del(6)(q14q27),del(8)(p11),dup(11)(q24q25),del(12)(p12p13),t(12;21) | no |
| ETV6/RUNX1_31 | M | 7 | (p13;q22),+der(21)t(12;21) |  |
| ETV6/RUNX1_32 | M | 8 | 48,XY, dup(10)(p11p15),t(12;21)(p13;q22),+16,+21 | yes |
| ETV6/RUNX1_33 | M | 6 | 46, XY,t(12;21)(p13;q22)/46,idem,add(12)(p13) | yes |
| ETV6/RUNX1_34 | F | 1 | ??,X?, del(12)(p13p13),t(12;21)(p13;q22),+21,+21 | yes |
| ETV6/RUNX1_35 | F | 6 | 46, XX, del(6)(q21),t(12;21)(p13;q22)/47, XX, t (12;21),+21/47, XX, $\mathrm{t}(12 ; 21),+\operatorname{der}(21) \mathrm{t}(12 ; 21)$ | yes |
|  |  |  | 46,XX, $\operatorname{der}(12) \mathrm{t}(12 ; 21)(\mathrm{p} 1 ? ; \mathrm{q} ?) \mathrm{t}(12 ; 16)(\mathrm{q} 1 ? ; \mathrm{p} 11), \operatorname{del}(16)(\mathrm{p} 11), \operatorname{del}(21)(\mathrm{q} 21 \mathrm{q} 22), \operatorname{der}(21) \mathrm{t}(12 ; 21)$ | yes |
| ETV6/RUNX1_36 | F | 6 | (p13;q22)t(12;12)(p13;q13) |  |
| ETV6/RUNX1_37 | F | 3 | 49,XX,+X,t(12;21)(p13;q22),+18,+21 | yes |

[^2]Supporting Information Table 2. Sister chromatid cohesion defects in REH cells with knockdown of RAD21 (RAD21.1 and RAD21.2) and controls.


Abbreviations: PCG, primary constriction gap.

Supporting Information Table 3. Sister chromatid cohesion defects in high hyperdiploid $(\mathrm{HeH})$ and ETV6/RUNX1-positive childhood acute lymphoblastic leukemia.

|  | No of | Total No of cells with | No of cells with PCG | No of cells with PCG | No of cells with PCG | No of cells with PCG | Overall frequency of chromosomes with |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Case | cells | PCG (\%) | I (\%) | II (\%) | III (\%) | IV (\%) | PCGs |
| HeH_1 | 11 | 1 (9.1) | 1 (100) | 0 | 0 | 0 | 0.00649 |
| HeH_2 | 25 | 5 (20) | 2 (40) | 3 (60) | 0 | 0 | 0.0353 |
| HeH_3 | 23 | 8 (35) | 5 (62) | 3 (38) | 0 | 0 | 0.0623 |
| HeH_4 | 28 | 19 (68) | 6 (32) | 11 (58) | 2 (10) | 0 | 0.0886 |
| HeH_5 | 33 | 19 (58) | 9 (47) | 10 (53) | 0 | 0 | 0.0515 |
| HeH_6 | 14 | 1 (7.1) | 1 (100) | 0 | 0 | 0 | 0.0225 |
| HeH_7 | 25 | 6 (24) | 5 (83) | 1 (17) | 0 | 0 | 0.0182 |
| HeH_8 | 5 | 2 (40) | 1 (50) | 1 (50) | 0 | 0 | 0.0453 |
| HeH_9 | 27 | 8 (30) | 4 (50) | 4 (50) | 0 | 0 | 0.0298 |
| HeH_10 | 5 | 0 | 0 | 0 | 0 | 0 | 0 |
| HeH_11 | 21 | 4 (19) | 3 (75) | 1 (25) | 0 | 0 | 0.0261 |
| HeH_12 | 4 | 1 (25) | 1 (100) | 0 | 0 | 0 | 0.0178 |
| HeH_13 | 6 | 1 (17) | 1 (100) | 0 | 0 | 0 | 0.0113 |
| HeH_14 | 39 | 33 (85) | 4 (12) | 23 (70) | 4 (12) | 2 (6.1) | 0.174 |
| HeH_15 | 11 | 3 (27) | 3 (100) | 0 | 0 | 0 | 0.0165 |
| HeH_16 | 19 | 1 (5.3) | 1 (100) | 0 | 0 | 0 | 0.00369 |
| HeH_17 | 10 | 3 (30) | 2 (67) | 1 (33) | 0 | 0 | 0.0277 |
| HeH_18 | 26 | 17 (65) | 2 (11) | 5 (30) | 9 (53) | 1 (5.8) | 0.237 |
| HeH_19 | 26 | 3 (11) | 3 (100) | 0 | 0 | 0 | 0.0377 |
| HeH_20 | 9 | 0 | 0 | 0 | 0 | 0 | 0 |
| HeH_21 | 7 | 0 | 0 | 0 | 0 | 0 | 0 |
| HeH_22 | 33 | 7 (21) | 4 (57) | 3 (43) | 0 | 0 | 0.0222 |
| HeH_23 | 22 | 2 (9.1) | 2 (100) | 0 | 0 | 0 | 0.00577 |
| HeH_24 | 6 | 0 | 0 | 0 | 0 | 0 | 0 |
| HeH_25 | 9 | 0 | 0 | 0 | 0 | 0 | 0 |
| HeH_26 | 35 | 16 (46) | 9 (56) | 6 (38) | 1 (6.3) | 0 | 0.0535 |
| HeH_27 | 30 | 6 (20) | 5 (83) | 1 (17) | 0 | 0 | 0.0131 |
| HeH_28 | 23 | 3 (12) | 2 (67) | 1 (33) | 0 | 0 | 0.0107 |
| HeH_29 | 29 | 7 (24) | 3 (43) | 4 (57) | 0 | 0 | 0.0240 |
| HeH_30 | 25 | 3 (12) | 3 (100) | 0 | 0 | 0 | 0.00772 |
| HeH_31 | 4 | 1 (20) | 1 (100) | 0 | 0 | 0 | 0.0132 |


| HeH_32 | 24 | 5 (21) | 2 (40) | 3 (60) | 0 | 0 | 0.0285 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| HeH_33 | 13 | 4 (30) | 4 (100) | 0 | 0 | 0 | 0.0159 |
| HeH_34 | 35 | 14 (40) | 11 (79) | 3 (21) | 0 | 0 | 0.0270 |
| HeH_35 | 37 | 6 (16) | 5 (83) | 1 (17) | 0 | 0 | 0.0128 |
| HeH_36 | 10 | 2 (20) | 1 (50) | 1 (50) | 0 | 0 | 0.0263 |
| HeH_37 | 24 | 7 (29) | 4 (57) | 3 (43) | 0 | 0 | 0.0393 |
| HeH_38 | 45 | 24 (53) | 12 (50) | 10 (42) | 2 (8.3) | 0 | 0.0550 |
| HeH_39 | 13 | 0 | 0 | 0 | 0 | 0 | 0 |
| HeH_40 | 44 | 30 (68) | 9 (30) | 17 (57) | 4 (13) | 0 | 0.102 |
| HeH_41 | 16 | 13 (81) | 2 (16) | 8 (61) | 3 (23) | 0 | 0.166 |
| HeH_42 | 7 | 1 (10) | 1 (100) | 0 | 0 | 0 | 0.0104 |
| HeH_43 | 29 | 0 | 0 | 0 | 0 | 0 | 0 |
| HeH_44 | 19 | 9 (47) | 6 (67) | 3 (33) | 0 | 0 | 0.0373 |
| HeH_45 | 15 | 10 (67) | 4 (40) | 5 (50) | 0 | 1(10) | 0.126 |
| ETV6/RUNX1_1 | 6 | 1 (14) | 1 (100) | 0 | 0 | 0 | 0.00362 |
| ETV6/RUNX1_2 | 25 | 1 (4.0) | 1 (100) | 0 | 0 | 0 | 0.000870 |
| ETV6/RUNX1_3 | 4 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_4 | 6 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_5 | 27 | 1 (3.7) | 1 (100) | 0 | 0 | 0 | 0.00161 |
| ETV6/RUNX1_6 | 8 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_7 | 24 | 4 (17) | 3 (75) | 1 (25) | 0 | 0 | 0.0118 |
| ETV6/RUNX1_8 | 20 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_9 | 27 | 2 (7.4) | 2 (100) | 0 | 0 | 0 | 0.00644 |
| ETV6/RUNX1_10 | 26 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_11 | 7 | 1 (14) | 0 | 1 (100) | 0 | 0 | 0.0466 |
| ETV6/RUNX1_12 | 11 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_13 | 16 | 1 (6.3) | 0 | 0 | 1 (100) | 0 | 0.0286 |
| ETV6/RUNX1_14 | 16 | 1 (6.3) | 0 | 1 (100) | 0 | 0 | 0.00833 |
| ETV6/RUNX1_15 | 8 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_16 | 25 | 2 (8.0) | 1 (50) | 1 (50) | 0 | 0 | 0.00522 |
| ETV6/RUNX1_17 | 20 | 1 (5.0) | 1 (100) | 0 | 0 | 0 | 0.00326 |
| ETV6/RUNX1_18 | 12 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_19 | 8 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_20 | 16 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_21 | 5 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_22 | 11 | 2 (18) | 1 (50) | 0 | 1 (50) | 0 | 0.00524 |
| ETV6/RUNX1_23 | 46 | 2 (4.3) | 2 (100) | 0 | 0 | 0 | 0.00189 |


| ETV6/RUNX1_24 | 32 | $2(18)$ | $5(83)$ | $1(17)$ | 0 | 0 | 0.0122 |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| ETV6/RUNX1_25 | 21 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_26 | 13 | $2(15)$ | $2(100)$ | 0 | 0 | 0 | 0.00669 |
| ETV6/RUNX1_27 | 17 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_28 | 51 | $2(3.9)$ | $2(100)$ | 0 | 0 | 0 | 0.000853 |
| ETV6/RUNX1_29 | 6 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_30 | 17 | $1(5.9)$ | $1(100)$ | 0 | 0 | 0 | 0.00256 |
| ETV6/RUNX1_31 | 23 | $1(4.3)$ | $1(100)$ | 0 | 0 | 0 | 0.000925 |
| ETV6/RUNX1_32 | 7 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_33 | 6 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_34 | 8 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_35 | 25 | $3(12)$ | $3(100)$ | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_36 | 4 | 0 | 0 | 0 | 0 | 0 | 0 |
| ETV6/RUNX1_37 | 5 | 0 | 0 | 0 | 0 | 0 | 0 |

[^3]Supporting Information Table 4. Copy number analysis by interphase-FISH of chromosomes $\mathrm{X}, 2,3,6,10$ and 21 in HeH ALL primary cases with high and low levels of cohesion defects, measured as PCG percentage per case.


Chromosome 10

| HeH_14 | 85\% | 0 | 25 (7.81) | 279 (87.2) | 16 (5.00) | 0 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| HeH_41 | 81\% | 0 | 96 (29.3) | 196 (59.7) | 36 (10.9) | 0 |  |
| HeH_18 | 65\% | 0 | 72 (22.6) | 225 (70.7) | 21 (6.60) | 0 |  |
|  |  |  |  |  |  |  | 0.0286 |
| HeH_30 | 12\% | 0 | 35 (8.06) | 358 (82.5) | 14 (3.23) | 0 |  |
| HeH_42 | 10\% | 0 | 13 (4.11) | 302 (95.6) | 1 (0.32) | 0 |  |
| HeH_23 | 9\% | 0 | 6 (1.97) | 295 (97.0) | 3 (0.99) | 0 |  |
| HeH_39 | 0\% | 0 | 28 (8.78) | 279 (87.5) | 12 (3.76) | 0 |  |
| Chromosome 21 |  |  |  |  | a |  |  |
| HeH_14 | 85\% | 0 | 2 (0.62) | 115 (35.6) | 183 (56.7) | 26 (8.05) |  |
| HeH_41 | 81\% | 0 | 6 (1.79) | 94 (28.1) | 201 (60.2) | 33 (9.88) |  |
| HeH_4 | 68\% | 0 | 2 (0.58) | 147 (42.9) | 189 (55.3) | 4 (1.17) |  |
| HeH_40 | 68\% | 0 | 4 (1.23) | 127 (39.1) | 185 (56.9) | 9 (2.77) |  |
| HeH_18 | 65\% | 0 | 6 (1.85) | 160 (49.4) | 128 (39.5) | 30 (9.26) |  |
|  |  |  |  |  |  |  | 0.0179 |
| HeH_42 | 10\% | 0 | 2 (0.66) | 29 (9.60) | 271 (89.7) | 0 |  |
| HeH_23 | 9\% | 0 | 3 (0.97) | 27 (8.77) | 278 (90.2) | 0 |  |
| HeH_39 | 0\% | 0 | 1 (0.33) | 33 (10.9) | 272 (89.8) | 0 |  |

Abbreviations: FISH, fluorescence in situ hybridization; HeH ALL, high hyperdiploid childhood acute lymphoblastic leukemia; PCG, primary constriction gaps.
${ }^{\mathbf{a}}$ Expected copy number for the given chromosome based on karyotype information and SNP array data.
${ }^{\text {b }}$ Mann-Whitney U test.

Supporting Information Table 5. Copy number analysis by interphase-FISH of chromosomes X, 2, 3 and 21 in REH cells with knock-down of RAD21 (RAD21.1 and RAD21.2) and controls.

|  | Monosomy | Disomy | Trisomy | Tetrasomy | Pentasomy | P-value ${ }^{\text {b }}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Chromosome X | a |  |  |  |  |  |
| Controls - No. of cells (\%) | 921 (98.1) | 18 (1.92) | 0 | 0 | 0 | 0.171 |
| RAD21-KD - No. of cells (\%) | 1224 (97.2) | 35 (2.78) | 0 | 0 | 0 |  |
| Chromosome 2 |  | a |  |  |  |  |
| Controls - No. of cells (\%) | 24 (2.59) | 849 (91.5) | 52 (5.60) | 3 (0.0323) | 0 | 0.131 |
| RAD21-KD - No. of cells (\%) | 63 (3.25) | 1714 (88.4) | 161 (8.29) | $2(0.0103)$ | 0 |  |
| Chromosome 3 |  | a |  |  |  |  |
| Controls - No. of cells (\%) | 14 (1.41) | 888 (89.7) | 88 (8.89) | 0 | 0 | 0.357 |
| RAD21-KD - No. of cells (\%) | 40 (2.03) | 1753 (89.1) | 174 (8.85) | 0 | 0 |  |
| Chromosome 21 |  |  | a |  |  |  |
| Controls - No. of cells (\%) | 7 (0.0757) | 99 (10.7) | 758 (81.9) | 58 (6.27) | 3 (0.0324) | 0.0286 |
| RAD21-KD - No. of cells (\%) | 41 (2.92) | 288 (20.5) | 887 (63.1) | 169 (12.0) | 21 (1.49) |  |

[^4]${ }^{\mathbf{a}}$ Expected copy number for the given chromosome based on karyotype information and SNP array data.
${ }^{\text {b }}$ Mann-Whitney U test.

Supporting Information Table 6. Analysis of mitosic cells by immunofluorescence microscopy in REH cells with knock-down of RAD21 (RAD21.1 and RAD21.2) and controls.

|  | Control | RAD21-KD |  |
| :--- | :---: | :---: | :---: |
| Categories | No of cells (\%) | No of cells (\%) | $\boldsymbol{P}$-value |
| Bipolar (normal) | $300(100)$ | $565(93.5)$ |  |
| All aberrations | 0 | $39(6.5)$ | 0.0119 |
| Spindle defects | 0 | $29(4.8)$ |  |
| Monopolar | 0 | $5(0.83)$ | 0.2381 |
| Tripolar | 0 | $18(2.9)$ | 0.0119 |
| Tetrapolar | 0 | $6(0.99)$ | 0.2381 |
| Chromatin bridges/ | 0 | $10(1.6)$ | 0.119 |
| Lagging chromosomes |  |  |  |

[^5]
## Article IV

# Clonal origin and development of high hyperdiploidy in childhood acute lymphoblastic leukaemia 

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#### Abstract

High hyperdiploid acute lymphoblastic leukemia (HeH ALL), one of the most common childhood malignancies, is driven by nonrandom aneuploidy (abnormal chromosome numbers) mainly comprising chromosomal gains. In this study, we investigate how aneuploidy in HeH ALL arises. Single cell whole genome sequencing of 2847 cells from nine primary cases and one normal bone marrow reveals that HeH ALL generally display low chromosomal heterogeneity, indicating that they are not characterized by chromosomal instability and showing that aneuploidy-driven malignancies are not necessarily chromosomally heterogeneous. Furthermore, most chromosomal gains are present in all leukemic cells, suggesting that they arose early during leukemogenesis. Copy number data from 577 primary cases reveals selective pressures that were used for in silico modeling of aneuploidy development. This shows that the aneuploidy in HeH ALL likely arises by an initial tripolar mitosis in a diploid cell followed by clonal evolution, in line with a punctuated evolution model.


The genetic origin of tumours remains obscure as the earliest stages of tumorigenesis cannot be observed. In the classic view of tumour development, cells acquire mutations in a stepwise manner, with clonal selection shaping the tumour genome over time and genomic heterogeneity arising by branching of different subclones ${ }^{1,2}$. However, in recent years this view has been challenged by data showing that some tumours arise by punctuated evolution, where the bulk of genetic aberrations occur within a short time frame at tumour initiation, followed by proliferation during which only little additional
genomic heterogeneity is added ${ }^{1,3,4}$. The punctuated evolution model appears to fit particularly well with copy number aberrations, both intrachromosomal and those involving whole chromosomes ${ }^{1}$.

The high hyperdiploid ( $\mathrm{HeH} ; 51-67$ chromosomes) subtype comprises $25-30 \%$ of all paediatric B-cell precursor acute lymphoblastic leukaemia (ALL). HeH ALL is characterized by nonrandom chromosomal gains predominately involving 1-2 extra copies of chromosomes $X, 4,6,10,14,17,18$, and 21 , whereas chromosomal losses are very rare ${ }^{5}$. Several lines of evidence suggest that the aneuploidy arises early in

[^6]HeH ALL, possibly already before birth ${ }^{6-10}$, although overt leukaemia does not occur until several years later. Furthermore, analyses of allelic ratios in tetrasomic chromosomes have suggested that the extra chromosomes are gained at the same time in one abnormal cell division ${ }^{11-13}$. However, the details on how HeH ALL develops genetically remain unknown.

We have addressed the origin of HeH ALL using single cell whole genome sequencing (scWGS), analyses of selection pressures in a large patient cohort, and through in silico modelling. We find that stable aneuploid karyotypes that we observe in HeH ALL likely arise during a single tripolar mitosis followed by low-level clonal evolution. Our findings shed light into the earliest stages of tumorigenesis of the most common malignancy in childhood.

## Results

## HeH ALL displays little genomic heterogeneity

To understand how the aneuploidy arises in HeH ALL, we first set out to determine the degree of genomic heterogeneity, in particular chromosomal heterogeneity as a readout of chromosomal instability (CIN). We performed low-pass scWGS of 257-348 individual bone marrow cells/case, in total 2847 cells, from nine primary hyperdiploid ALL cases (2-13 years old at diagnosis; median 5 years) and one normal bone marrow sample (Supplementary Table 1). Copy number analysis for each individual cell was carried out with a resolution of approximately 5 Mb . For some chromosomes, we investigated which chromosomal homologue that was gained, lost, or displayed uniparental isodisomy (UPID; disomies involving two copies of the same chromosomal homologue) taking advantage of heterozygous variants identified through bulk WGS of matched samples. Phylogenetic trees were then constructed based on the combined data from scWGS, bulk WGS, and fluorescence in situ hybridization (FISH).

The normal bone marrow displayed diploidy in 269/270 cells ( $99.6 \%$ ), with only one cell deviating by loss of chromosome 21 , showing the high quality of the scWGS (Fig. 1). Of the 2577 cells in the leukaemic samples, five were normal diploid cells and the rest showed copy number changes agreeing with leukaemic cells. Overall, highly homogeneous genomes were seen for most of the leukaemias (Fig. 1), with predominantly whole chromosome gains being present in all cells. When assessing whole chromosome changes, $5 / 9$ cases had the same chromosomal content in $>99 \%$ of the cells, with only 1-2 cells displaying gains or losses of single chromosomes that were not seen in the other cells, suggesting a chromosome missegregation rate highly similar as observed for the normal bone marrow. The remaining four cases had 3-5 numerical subclones each (a clone being defined as at least two cells with the same genetic aberrations), with the major clone making up 55-88\% of the cells (Table 1). For $3 / 4$ cases, at least one of these subclones was also detectable in copy number analysis of bulk DNA; i.e. they would appear to harbour subclones also by this method. Case 2, however, displayed three minor subclones, each corresponding to 2.7-3.9\% of the cells, which analysis of bulk DNA failed to detect so that it appeared to have only one clone. Analysis of chromosomal homologues revealed hidden heterogeneity in \#9, where trisomy 17 involved different homologues in two distinct cell populations (Supplementary Fig. 1); this was, however, the only case of haplotype heterogeneity found among the 62 chromosomal gains/UPIDs that could be investigated.

Next, we calculated heterogeneity scores for each case (Table 1). There was no correlation between the heterogeneity scores and the number of cells sequenced, showing that the results were not skewed based on the number of cells included ( $r_{s}=-0.38, P=0.32$; two-sided Spearman's correlation test; Supplementary Fig. 2). Cases with relatively few subclones (\#1, \#5, \#6, \#7, and \#8) had lower scores than cases with more subclones (\#2, \#3, \#4, and \#9). To investigate whether the observed differences in heterogeneity were due to mutations in genes affecting genomic stability, we screened bulk WGS data, but no
such correlation was seen (Supplementary Table 1). We further investigated whether increased heterogeneity correlated with the presence of sister chromatid cohesion defects in metaphase chromosomes, which we have recently reported to be associated with increased chromosomal heterogeneity in HeH ALL ${ }^{14}$. Indeed, \#2, which had the second highest heterogeneity score, had a very high frequency of cohesion defects in metaphase cells (85\%; Table 1). However, \#3, \#4 and \#9, which also had high heterogeneity scores, had relatively few cells with cohesion defects. Overall, however, although the heterogeneity scores varied between cases, all had relatively low levels of heterogeneity, with non-clonal changes only seen in $0-2.6 \%$ of the cells.

In conclusion, the scWGS analysis revealed very low to low chromosomal heterogeneity in HeH childhood ALL. Thus, these leukaemias appear to have relatively stable genomes, despite being aneuploid.

## The chromosomal gains are early and ubiquitously present in HeH ALL

To understand how hyperdiploidy develops in the absence of CIN, we studied the phylogenetic trees of the chromosomal changes (Fig. 2). In all cases, the majority of chromosomal gains were seen at the roots of the trees, with most remaining stable and unchanging. The pattern of chromosomal gains in the inferred initial leukaemic cells resembled the one usually seen in HeH ALL: chromosomes X (100\%), 21 (100\%), 4 (89\%), 14 (89\%), 18 (89\%), 6 (67\%), 10 (67\%), 17 (67\%), 8 (44\%), 9 (33\%), 5 (22\%), $16(22 \%), 3(11 \%), 11(11 \%)$, and $12(11 \%)$. Looking at chromosomal gains only, those in the earliest clone and in the major clone were identical in $5 / 9(56 \%)$ of the cases, with the remaining four cases differing by gain or loss of 1-2 chromosomes. Thus, most extra chromosomes found at diagnosis were acquired early in leukemogenesis, in line with previous studies of $\mathrm{HeH}_{\mathrm{ALL}^{6-1}}$. Calculation of phylogenetic distances showed long truncal and short branching distances, suggesting punctuated evolution (Supplementary Fig. 3). ${ }^{1}$. Chromosomes that changed in copy number during clonal evolution comprised $\mathrm{X}, 8$, $9,14,16,17$, and 21 (Fig. 2). Several cases displayed more than one instance of a particular chromosomal copy number change during their clonal evolution, comprising losses of 9 (two events in \#2), gains of 17 (two events in \#9), and gains of 21 (two events in \#4), indicating strong clonal selection for these changes.

Only few clonal structural changes leading to copy number changes were detected by scWGS, in line with such events being relatively rare in hyperdiploid $\mathrm{ALL}^{10}$. In 7/9 cases, no structural changes were present in the inferred earliest cell, indicating that such abnormalities typically arose after the bulk of the chromosomal gains (Fig. 2). Duplication of $1 q$ [dup(1q)] was seen in subclones in three different cases; one of which (\#2) had dup(1q) with different breakpoints between two subclones. scWGS also revealed more complex patterns of copy number changes associated with structural events in \#3 and \#4. Further analysis with FISH and bulk WGS confirmed that these structural abnormalities involved complex rearrangements of chromosomes 16 and 14, respectively (Fig. 2, Supplementary Fig. 4). Thus, scWGS can also be used to delineate complex structural events.

Taken together, phylogenetic analysis of the scWGS data showed that most of the chromosomal gains were present at the root of the phylogenetic trees, with clonal evolution involving gains or losses of 1-2 chromosomes in approximately half of the cases. Structural changes, on the other hand, generally occurred later during leukemogenesis.

## Aneuploid pattern based on copy number changes in 577 cases reveals selective pressures

To elucidate further the aneuploid pattern in HeH ALL, we next studied copy number data derived from single nucleotide polymorphism (SNP) arrays, whole exome sequencing (WES), or WGS for 577 primary


Fig. 1 | Single cell whole genome sequencing results from nine primary high hyperdiploid childhood acute lymphoblastic leukaemia cases and one normal bone marrow. The heatmaps show the genome-wide copy number of each
 Overall, only low to very low levels of copy number heterogeneity was seen. Created with BioRender.com. Source data are provided as a Source Data file.
chromosomes 21 ( $100 \%$ ), X ( $97 \%$ ), 14 ( $95 \%$ ), 6 ( $89 \%$ ), 18 ( $83 \%$ ), 4 ( $82 \%$ ), $17(78 \%)$, and $10(74 \%)$, indicating a strong selection for extra copies of these chromosomes and suggesting that these gains are highly likely driver events. Six additional gains were relatively common: chromosomes $8(38 \%), 5(23 \%), 9(19 \%), 11(14 \%), 12(14 \%)$, and $22(11 \%)$. These copy number alterations might also be (co-)driving events, at least occasionally. The remaining autosomal chromosomes were gained in $<10 \%$ of the cases and hence unlikely to provide a selective advantage; some, such as chromosomes 13 and 20 , which were recurrently monosomic, may even be selected against. Chromosome Y displayed

Table 1 | Genetic heterogeneity in nine high hyperdiploid childhood acute lymphoblastic leukaemia cases based on single cell whole genome sequencing

| Case | Number of cells sequenced | Number of clones (\% of cells) ${ }^{\text {a }}$ | Number of clones-numerical changes only (\% of cells) ${ }^{\text {a }}$ | Number of cells with a unique genome | Genome-wide heterogeneity score | \% of cells with PCG |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 269 | $\begin{aligned} & 2 \\ & (\mathrm{~A}, 98 \% ; \mathrm{C}, 1.9 \%) \end{aligned}$ | $\begin{aligned} & 1 \\ & (\mathrm{~A}, \mathrm{C}, 100 \%) \end{aligned}$ | 1 | 0.07 | 22 |
| 2 | 257 | $\begin{aligned} & 6 \\ & \text { (A, 88\%; E, 3.9\%; D, 2.7\%; I, } \\ & \text { 1.9\%; F, 1.2\%; H, O.8\%) } \end{aligned}$ | 4 <br> (A, 88\%; E, 3.9\%; F, H, I, 3.9\%; D, 2.7\%) | 5 | 1.20 | 85 |
| 3 | 272 | $\begin{aligned} & 4 \\ & \text { (E, 64\%; A, 30\%; H, } \\ & 2.6 \% ; G, 0.7 \%) \\ & \hline \end{aligned}$ | $\begin{aligned} & 3 \\ & (E, G, 65 \% ; A, 30 \% ; H, 2.6 \%) \end{aligned}$ | 7 | 1.16 | 14 |
| 4 | 348 | $\begin{aligned} & \text { 5 } \\ & \text { (H, 55\%; C, 34\%; A, 8.9\%; E, } \\ & 0.9 \% ; \mathrm{I}, 0.6 \%) \end{aligned}$ | $\begin{aligned} & 5 \\ & \text { (H, 55\%; C, 34\%; A, 8.9\%; E, } \\ & 0.9 \% ; \mathrm{I}, 0.6 \%) \end{aligned}$ | 5 | 5.11 | 19 |
| 5 | 347 | $\begin{aligned} & 2 \\ & (\mathrm{~A}, 96 \% ; \mathrm{D}, 2.9 \%) \end{aligned}$ | $\begin{aligned} & 1 \\ & (A, D, 99 \%) \end{aligned}$ | 3 | 0.18 | 20 |
| 6 | 271 | $\begin{aligned} & 2 \\ & (A, 99 \% ; B, 0.7 \%) \end{aligned}$ | $\begin{aligned} & 1 \\ & (A, B, 100 \%) \end{aligned}$ | 0 | 0.04 | 5 |
| 7 | 273 | $\begin{aligned} & 1 \\ & (\mathrm{~A}, 100 \%) \end{aligned}$ | $\begin{aligned} & 1 \\ & (\mathrm{~A}, 100 \%) \end{aligned}$ | 1 | 0.12 | 10 |
| 8 | 266 | $\begin{aligned} & 1 \\ & (A, 99 \%) \end{aligned}$ | $\begin{aligned} & 1 \\ & (\mathrm{~A}, 99 \%) \end{aligned}$ | 3 | 0.16 | 0 |
| 9 | 269 | $\begin{aligned} & 4 \\ & \text { (B, 75\%; F, 15\%; A, } \\ & 7.1 \% ; \text { I, 0.7\%) } \end{aligned}$ | $\begin{aligned} & 4 \\ & (B, 75 \% ; F, 15 \% ; A, 7.1 \% ; I, 0.7 \%) \end{aligned}$ | 7 | 0.69 | 10 |

PCG primary constriction gap.
${ }^{\text {a }}$ Letters correspond to different clones as denoted in Fig. 2.
both gains ( $21 \%$ of male cases)-always as XXYY or XXXYY-and nullisomy ( $4 \%$ of male cases), indicating that it is neutral to selection.

Recurrent tetrasomies were seen for chromosomes 21 (81\%), X/Y ( $20 \%$; including XXXX in females and XXXY/XXYY in males), 14 ( $17 \%$ ), 18 (12\%), 10 (8.3\%), 8 (2.6\%), and 4 (1.7\%). The majority ( $787 / 829 ; 95 \%$ ) of tetrasomies were of the 2:2 type, i.e. showed duplication of both chromosomal homologues. Of the 42 3:1 tetrasomies (triplication of one homologue and retention of the other), 31 ( $74 \%$ ) were for chromosome 21 and five ( $12 \%$ ) were XXXY. Apart from one case with XXXYY, pentasomy was only seen for chromosome 21 ( $4.5 \%$ of cases), indicating that the selection for extra copies of this chromosome is particularly strong.

UPIDs were seen in 208/577 (36\%) of the cases (median 1/case, range $1-6$ ). The UPIDs/all disomies ratio was $0-5 \%$ for all chromosomes except for chromosome 9 , where it was $17 \%$. This rather constant frequency (except for chromosome 9) suggests that, in general, UPIDs are passenger events.

## Subclonality indicates selective pressures

Copy number analysis based on bulk samples has a limited resolution in detecting subclones, with an approximate detection limit of subclones corresponding to $20-30 \%$ of the cells (Supplementary Fig. 6). Nevertheless, subclonality involving relatively large clones that are detectable with this method can indicate ongoing clonal evolution and may reveal selective pressures in the leukaemic population. The majority ( $72 \%$ ) of the 577 HeH ALLs did not have detectable subclonality involving whole chromosomes, agreeing well with the scWGS data. Most chromosomes displayed subclonality in $<3 \%$ of cases, but higher levels were seen for chromosomes 8 (4.5\%), 9 (8.7\%), 21 (3.6\%), and X in females (5.1\%) (Supplementary Table 2). For chromosomes 8, 9 , and $X$, subclonality was mainly seen between two and three copies, either in the form of (hetero)disomy/trisomy or in the form of UPID/ trisomy; two forms of subclonality that have approximately the same detection limits in the HeH scenario. Whereas the former of these could arise either by an initial disomy becoming a trisomy or vice versa, the latter can only arise from initial trisomy by loss of one
chromosomal homologue (Supplementary Fig. 7). Then, the likelihood is $2 / 3$ that it becomes a heterodisomy (normal disomy with retained heterozygosity) and $1 / 3$ that it becomes a UPID. Most chromosomes conformed to the expected ratio of subclonal disomy/trisomy to UPID/ trisomy (Supplementary Table 2), suggesting loss from trisomy. For chromosome X in females, however, trisomy/UPID subclonality was significantly more common than expected ( $P=2.60 \times 10^{-4}$; two-sided exact binomial test), which is likely explained by preferential loss of the inactive $X$, as it is usually the active $X$ that is duplicated in HeH ALL with trisomy $\mathrm{X}^{12}$. Chromosome 8 displayed borderline significance ( $P=0.0529$; two-sided exact binomial test) for fewer cases with subclonal UPID/trisomy than expected (Supplementary Table 2), possibly indicating that some cases were gaining an extra chromosome from a disomy, in line with positive selection. Chromosome 9 displayed frequencies of subclonal disomy/trisomy and UPID/trisomy agreeing with loss from a trisomic state, indicating selection against trisomy. Finally, subclonality for chromosome 21 was mainly seen for trisomy/tetrasomy and tetrasomy/pentasomy, indicating selection for extra chromosomal copies. Altogether, selection against extra copies of chromosome 9 and for extra copies of chromosome 21 and possibly chromosome 8 was apparent, with the reservation that subclones corresponding to less than $20-30 \%$ of the cells could not be analyzed.

## Comparison of diagnostic and relapse samples shows positive

 selection for trisomy 8 and negative for trisomy 9Selective pressures can also be inferred from comparing paired samples obtained at different time points. We studied chromosomal copy number and ascertained whether trisomies and UPIDs involved the same chromosomal homologue in paired diagnostic/relapse samples from 23 cases. Such samples have previously been shown to be clonally related and display overall very similar karyotypes ${ }^{15,16}$. In total, 4.4\% of 529 chromosomal pairs differed in copy number between the diagnostic and relapse samples (Supplementary Data 2). Of the 171 investigated trisomies and UPIDs, only one trisomy 8 involved different chromosomal homologues in the diagnostic and relapse sample, indicating that heterogeneity of this type is rare in HeH ALL.


Fig. 2 | Phylogenetic trees showing the most probable course of genetic evolution, based on single cell whole genome sequencing (scWGS), bulk WGS, and fluorescence in situ hybridization in nine primary childhood acute lymphoblastic leukaemia cases and one normal bone marrow. The bulk of the chromosomal gains was present already in the inferred earliest cells, with 1-2
chromosomes being gained or lost during clonal evolution in some of the cases. *indicates that the direction of the clonal evolution cannot be determined. Diso heterodisomy, Hom1 homologue 1, Hom2 homologue 2, UPID uniparental isodisomy. Created with BioRender.com.

Chromosomes that recurrently differed between diagnostic and relapse samples were chromosomes $8(17 \%), 4,9,21(13 \%)$, and $X, 7,10$, and 15 ( $8.7 \%$ ). Trisomy 8 displayed signs of positive selection, as it never went from trisomy to UPID and as the trisomy involved different homologues in one case. Chromosome 9, on the other hand, displayed UPID in one sample and heterodisomy in the other in three cases, indicating an original clone with trisomy 9 that was selected against.

Altogether, analyses of the frequencies of chromosomal gains, subclonality patterns, and paired diagnostic/relapse samples suggested that the chromosomal gains in HeH ALL can be divided into three groups based on the selective pressures: chromosomes $X, 4,6$, $10,14,17,18$, and 21 , which are associated with strong positive selection (group strong-pos), chromosomes $5,8,11,12$, and 22 , which are associated with weaker positive selection (group weak-pos), and chromosomes $Y, 1-3,7,9,13,15,16,19$, and 20 , which are neutral or associated with negative selection (group neg).

## Simulation of HeH development suggests formation by a tripolar mitosis

To understand further how the aneuploidy in HeH ALL arises, we next simulated hyperdiploidy development in silico under different scenarios. We included five possible routes to aneuploidy that have been reported to occur in cancer ${ }^{17}$ : (1) sequential gains in a diploid cell (diploid/sequential), (2) initial tetraploidy followed by chromosomal losses (tetraploid/sequential), (3) tripolar division in a diploid cell (diploid/tripolar), (4) tripolar division in a tetraploid cell (tetraploid/ tripolar), and (5) mitotic catastrophe resulting from complete loss of sister chromatid cohesion (mitotic catastrophe) (Supplementary Fig. 8). For models 3, 4, and 5, the simulation started with an abnormal mitosis directly resulting in aneuploid daughter cells according to the respective mechanism, followed by a low likelihood of nondisjunction of individual chromosomes, whereas mechanisms 1 and 2 started with a diploid or tetraploid cell, respectively, followed by individual nondisjunction events. First, we only included positive selection for the strong-pos group of chromosomes, i.e. $\mathrm{X}, 4,6,10,14,17,18$, and 21 , with gains of chromosome 21 given the highest selective advantage based on its ubiquitous presence in these leukaemias. Briefly, 50,000 virtual cells were followed over multiple generations, with gain of strong-pos chromosomes increasing survival probability in the daughter cells and other nondisjunction events lowering it. Since the UPID frequency in the patient cohort was constant at $2.5 \%$ for non-strong-pos chromosomes (except chromosome 9), simulations were stopped when this level was reached. The resulting virtual cell populations were then compared with the chromosomal patterns in the 577 primary HeH ALLs.

All models resulted in a continuous increase in the UPID frequency over generations (Supplementary Fig. 9A). For the diploid/ tripolar and diploid/sequential models, UPID frequencies of 2.5\% were reached after 50-800 generations (median 72.5 and 485 , respectively) and for the tetraploid/sequential model within 10 generations. For the tetraploid/tripolar and mitotic catastrophe models, the initial UPID frequency was $>2.5 \%$ ( $18.2 \%$ and $9.9 \%$, respectively) and plateaued at $>30 \%$ after 1000 generations. Since this was inconsistent with the patient data, they were removed from further testing.

Next, we investigated the average number of trisomies/tetrasomies at different modal chromosome numbers (MCN). Interestingly, a marked elevation change was observed at MCN 62 for trisomies in the patient cohort (Fig. 3a), indicating that there may be two subgroups with different trisomy:tetrasomy ratios: MCN 51-61 ( $n=545$ ) and MCN 62-67 $(n=32)$, respectively. This suggests that HeH ALL with lower and higher MCN could arise through different mechanisms. Therefore, we investigated these groups separately in the following analyses.

Starting with MCN 51-61, we observed that the tetraploid/ sequential model resulted in very few such cells (Supplementary

Fig. 9B). We therefore concluded that this model could not give rise to HeH with MCN 51-61 and excluded it from further testing. We then compared the pattern of trisomies and tetrasomies at different MCN (Fig. 3a) and the pattern of trisomies and tetrasomies for each chromosome (Fig. 3b) between the HeH ALL patient data and the simulations results by the root mean squared error (RMSE) method (Supplementary Table 3). The diploid/tripolar and diploid/sequential models both showed low RMSE values, indicating that they fit relatively well with the patient data. We next looked at the frequency of tetrasomy 21 of the 2:2 type (duplication of both homologues) and 3:1 type (triplication of one homologue). In the diploid/sequential model, the 3:1 type was enriched during the simulation process, resulting in $64 \%$ tetrasomy 21 of this type. However, the patient data and the diploid/ tripolar model both showed lower proportions of tetrasomy 3:1 (6.6\% and $21 \%$, respectively), supporting a diploid/tripolar origin. Notably, 3:1 tetrasomies were not an indication of one homologue being selected for, but rather resulted from the strong overall selection for extra copies of chromosome 21 in both models. To see if we could fine-tune the diploid/tripolar further, we included positive selection also for the weak-pos chromosomes. The modified version yielded even lower RMSE values than the original one (Supplementary Table 3). Hence, our simulations showed that the diploid/tripolar model consistently resulted in virtual cells with karyotypes similar to those seen in HeH ALL with MCN 51-61. Furthermore, sampling of the simulation results over consecutive generations showed that the diploid/tripolar model displayed whole chromosome copy number evolution consistent with a punctuated evolution model, with an initial sharp rise in chromosome numbers (Supplementary Fig. 10).

Next, we turned to the MCN 62-67 group, again studying the pattern of trisomies and tetrasomies at different MCN and for different chromosomes. Here, both the diploid/tripolar and the tetraploid/ sequential models agreed well with the patient data (Supplementary Table 3), with the tetraploid/sequential model more closely following the distribution of average number of trisomies and tetrasomies across MCNs (Fig. 3a). We included selection for the weak-pos chromosomes also here and, since the UPID frequency is higher at higher MCNs, let the simulations run to a UPID frequency of $5 \%$. Both the diploid/tripolar and tetraploid/sequential models resulted in virtual cells that fit well with the patient data (Supplementary Table 3). Interestingly, looking at the patient copy number data, cases with MCN 62-67 had more subclonality, with half of these cases (16/32) harbouring $\geq 1$ subclonal chromosome; significantly higher than observed in the other HeH ALLs ( $P=0.0006$; two-sided Fisher's exact test). Furthermore, the only case in the scWGS analysis with MCN in this range (\#3) also had a relatively high heterogeneity score.

Taken together, our modelling in conjunction with the patient data suggested that, in most instances, high hyperdiploidy in paediatric ALL arises by a tripolar division in a diploid cell. However, HeH ALL with MCN 62-67 (comprising around $5 \%$ of cases) may possibly arise by initial tetraploidy followed by chromosomal losses.

## Chromosomal age pattern validates a tripolar division origin

In the diploid/tripolar model, most chromosomes are gained in the initial mitosis but some are gained and fixed during clonal selection. Seeking to validate our results from the in silico modelling, we reasoned that chromosomes that are gained later during clonal evolution should primarily be those that give a selective advantage, i.e. the strong-pos and weak-pos groups. In contrast, neg chromosomes would all have been gained at the initial division since they would not be selected for, although some may arise later due to drift. Therefore, we hypothesized that strong-pos and weak-pos trisomies should, on average, be newer than neg trisomies. If the hyperdiploidy instead arose by sequential gains, there would be no difference in the ages of the trisomies between these groups, as they could arise in any order (Fig. 4a).


Fig. 3 | Simulation of high hyperdiploidy development in childhood acute lymphoblastic leukaemia according to five different models: (1) sequential gains in diploid cell (diploid/sequential), (2) initial tetraploidy followed by chromosomal losses (tetraploid/sequential), (3) tripolar division in a diploid cell (diploid/tripolar), (4) tripolar division in a tetraploid cell (tetraploid/tripolar), and (5) mitotic catastrophe resulting from complete loss of sister chromatid cohesion (mitotic catastrophe). Data shown are from the end point in the simulations. a Correlation between the average number of trisomies/tetrasomies and the modal chromosome number (MCN) in the simulation results and the patient cohort of 577 cases of high hyperdiploid ALL. The average number of trisomies at each modal number in the diploid/tripolar model closely follows what is seen in the patient cohort at MCN 51-61, indicating a very good fit of the model to patient data. At MCN 62-67, there is a sharp increase in the average number of trisomies per modal number in the patient cohort (indicated by a grey square), and it follows the tetraploid/sequential model more closely, possibly indicating a
different mechanism. The average number of tetrasomies at each modal number in the patient cohort is based on fewer chromosomes (since tetrasomies are less common than trisomies) and follows most closely the diploid/tripolar and the tetraploid/sequential models for MCN 51-61 and MCN 62-27, respectively. b Pattern of chromosomal copy number changes and uniparental isodisomies resulting from the simulations according to each model and in the patient cohort. Frequency of each type of aberration (as given in the legend) is seen on the Y axis and each chromosome (except Y ) on the X axis. Whereas the tetraploid/sequential, tetraploid/tripolar, and mitotic catastrophe model all result in chromosomal patterns very different from the one seen in the patient cohort, the diploid/sequential model, diploid/tripolar model, and patient cohort display relatively similar patterns. However, based on the high frequency of 3:1 tetrasomies in the diploid/ sequential model it could be excluded, leaving the chromosomal pattern resulting from the diploid/tripolar model most similar to the one seen in the primary cases. Source data are provided as a Source Data file.


To investigate the age of different trisomies, we studied somatic single nucleotide variants (SNVs) in trisomies based on WGS in 67 HeH ALL. We utilized that SNVs that are present already before the trisomy forms (BTRI mutations) will be duplicated if they are in the gained homologue and display variant allele frequencies (VAFs) of $\sim 0.67$. Conversely, SNVs that arise after the trisomy or in the homologue that is not duplicated will only be present in one of the homologues and display VAFs of $\sim 0.33$ (B/ATRI mutations) (Fig. 5a, b). Hence, the proportion of SNVs that are of the BTRI type will be higher the newer the trisomy is, since the chromosome will have spent a longer time as not duplicated, allowing time for more mutations to arise. Among the 67 investigated cases, 536 of 15,828 SNVs ( $3.39 \%$ ) in groups strong-pos and weak-pos chromosomes were of the BTRI type and 9 of 819 (1.09\%) in group neg chromosomes $\left(P=2.2 \times 10^{-5}\right.$; Mann-Whitney two-sided test) (Fig. 4b). Thus, the former chromosomal gains were on average newer than the remaining trisomies, in line with what would be expected from a diploid/tripolar origin.

## Mutational signatures show different etiological factors during leukemogenesis

To gain further insight into the leukemogenesis of HeH ALL, we studied mutational signatures in 67 cases with bulk WGS data. We investigated BTRI and B/ATRI mutations in trisomic chromosomes and relapse-specific mutations, since these groups can be put into a distinct timeline (Fig. 5a, b). BTRI mutations were predominantly associated with mutational signatures SBS1 and SBS5 (Fig. 5c); known clocklike signatures likely caused by intrinsic mutational processes ${ }^{18,19}$. Their high frequency at the earliest time point, before the hyperdiploidy arises, agrees well with an early origin devoid of environmental exposure. B/ATRI mutations displayed a wider range of mutational signatures, with SBS1, SBS5, SBS7a, SBS8, SBS18, SBS19, and SBS39 all contributing (Fig. 5c). Of these, SBS7a has been associated with ultraviolet light exposure ${ }^{20}$; this signature has previously been reported to dominate in some cases of aneuploid childhood ALLs ${ }^{10,21}$ and it was present in six ( $9.0 \%$ ) cases. SBS8 has been suggested to be associated with late replication errors ${ }^{22}$, whereas SBS18 has been linked to
mutagenesis by reactive oxygen species ${ }^{23}$. SBS19 and SBS39 have unknown etiologies ${ }^{20}$. Mutations specific for the relapse samples, which represent the latest mutations, were similar to the B/ATRI mutations, but with addition of signatures SBS15, SBS26, and SBS87 (Fig. 5c), as has previously been reported for the TARGET cohort ${ }^{24}$. SBS15 and SBS26 are associated with defective DNA mismatch repair ${ }^{24}$, whereas SBS87 is associated with thiopurine treatment and hence likely induced by chemotherapy ${ }^{24}$.

Temporal analysis of additional somatic events shows that the chromosomal gains are early
To determine when other somatic genetic events occur in relation to the chromosomal gains, we analyzed structural rearrangements, deletions, and mutations, focusing on (1) subclonality and (2) events occurring in gained chromosomes or UPIDs, where the temporal order could be investigated by looking at the allelic patterns.

For structural rearrangements, the analysis comprised known drivers that can be identified from copy number data: dup(1q), deletions of 6 q [del $(6 \mathrm{q})]$, isochromosomes $7 \mathrm{q}[\mathrm{i}(7 \mathrm{q})]$, and partial gains of $17 q(\text { gain_17q) })^{25,26}$. Of these, dup(1q), del(6q), and gain_17q were frequently subclonal ( $30-40 \%$ of cases), whereas $i(7 q$ ) was generally present in the main clone (Supplementary Table 4). One case had two different subclonal dup(1q), similar to \#2 in the scWGS analysis (Fig. 2). Furthermore, analysis of BTRI and B/ATRI mutations showed a significantly higher proportion of BTRI mutations in dup(1q) than in trisomies (median $29.4 \%$ vs. $4.3 \% ; P=4.9 \times 10^{-4}$; Mann-Whitney two-sided test), indicating a later origin (Supplementary Fig. 11). Temporal order could be determined for $\operatorname{dup}(1 q)$ and $\operatorname{del}(6 q)$, showing that $8 / 8$ and 22/ 22 informative cases, respectively, arose after the UPID or chromosomal gain (Supplementary Table 4).

Deletions of IKZF1, CDKN2A, PAX5, ETV6, CREBBP, and TCF3 ${ }^{26,27}$ were subclonal in $10-40 \%$ of the cases (Supplementary Table 4). Temporal analysis showed that $15 / 16$ CDKN2A deletions, $1 / 1$ PAX5 deletion, 8/9 ETV6 deletions, and 1/1 CREBBP deletion occurred after the respective UPID or trisomy. Thus, most informative deletions happened after the respective chromosome became


Fig. 5 | Patterns of somatic mutations in high hyperdiploid acute lymphoblastic Ieukaemia. a Timeline of mutations arising either before the trisomies (BTRI mutations), before/after the trisomies (B/ATRI mutations), and at relapse. b Variant allele frequencies (VAFs) in bulk sequencing data of scWGS case 1 for all mutations in relation to copy number based on the number of reads for that particular chromosome segment. BTRI mutations, which are present in $2 / 3$ chromosomal homologues and have VAFs of -0.67 , are shown in purple and $\mathrm{B} / \mathrm{ATRI}$ mutations,
which are present in $1 / 3$ chromosomal homologues and have VAFs of -0.33 , are shown in grey. c Relative contribution of the ten most common SBS signatures in BTRI mutations in trisomic chromosomes, B/ATRI mutations in trisomic chromosomes, and mutations specific for relapse samples. NER nucleotide excision repair, ROS reactive oxygen species, SBS single base substitutions, UV ultraviolet. Figure 5a was created with BioRender.com. Source data are provided as a Source Data file.
trisomic, but one somatic CDKN2A deletion and one ETV6 deletion (which we have previously shown to be constitutional ${ }^{26}$ ) occurred at a disomic state.

Finally, we looked at 338 driver mutations in 218 cases where WES or WGS data were available. Of these, $150(44 \%)$ were subclonal (Supplementary Tables 4 and Supplementary Data 3). For clonal mutations in trisomies, tetrasomies, or UPIDs, mutations were also classified as B/ATRI or BTRI. Sixty (92\%) B/ATRI mutations and five (8.7\%) BTRI mutations were found, including one IKZF1 mutation in a case with UPID7 (Supplementary Data 3).

Taken together, the analysis showed that structural rearrangements, deletions, and mutations were frequently subclonal and generally occurred after the chromosomal event, supporting an overall scenario where the hyperdiploidy arises first and other somatic aberrations occur at later stages.

## Discussion

We have performed a detailed analysis of the genetic mechanisms and the temporal order of different genetic events in HeH ALL. Using a combination of scWGS and in-depth analysis of SNP array and sequencing data from a large cohort of cases, we show that the chromosomal gains are early events and relatively stable throughout leukaemia development, whereas structural rearrangements and mutations generally occur later. In silico simulations of high hyperdiploidy development suggested that an initial tripolar division in a diploid cell, followed by clonal selection, best recapitulated the chromosomal patterns seen in patient samples.

Whether HeH ALL exhibits CIN has been debated. Cytogenetic data as well as bulk copy number analysis with SNP arrays have sug. gested that these leukaemias generally are chromosomally stable, with most cells displaying the same chromosomal gains ${ }^{5,26,28}$. However,
cytogenetic analyses only comprise the dividing cells and misclassification of chromosomes can lead to underestimation of heterogeneity, whereas SNP arrays cannot detect all minor clones. Several previous studies have also used interphase FISH to investigate chromosomal heterogeneity ${ }^{14,29-31}$, but with variable results and conclusions, likely due to a high degree of technical artifacts ${ }^{5}$. Here, we used scWGS to circumvent the above problems. This method is superior for characterizing copy number heterogeneity by including all cells-also non-dividing-and due to unequivocal identification of chromosomes ${ }^{32}$. We found relatively little chromosomal heterogeneity, with non-clonal numerical changes seen in only $12(0.47 \%)$ of all 2572 leukaemic cells sequenced and $5 / 9$ cases having identical chromosomal content in $>99 \%$ of the cells (Fig. 1). Of the remaining four cases, three displayed subclones that were also detectable by SNP array analysis, and only one appeared to have a single clone by SNP array analysis when in fact it had several minor clones. Thus, scWGS strongly supports that HeH ALL is chromosomally stable, in line with cytogenetic and SNP array data. Notably, this also shows that aneuploidy in cancer does not lead to CIN per se; something that has also been debated ${ }^{33,34}$.

Although HeH ALL overall appeared stable, there was nevertheless some variation in heterogeneity between cases. We recently reported a high but varying frequency of sister chromatid cohesion defects in HeH ALL, possibly associated with low levels of cohesin and/or condensin ${ }^{14}$. Case 2 had cohesion defects in $85 \%$ of the metaphase cells, possibly explaining the high heterogeneity in this case. However, the remaining eight cases all had percentages of cells displaying cohesion defects that were at or below the median value ( $21 \%$ ) in our previous study ${ }^{14}$ (Table 1). Thus, it is possible that we would have found more chromosomal heterogeneity by scWGS if more cases with severe cohesion defects had been included in this study.

Several mechanisms have been suggested for how the extra chromosomes in HeH ALL are gained, including one abnormal mitosis, loss of chromosomes from a tetraploid cell, sequential gains due to CIN , and, most recently, fusion of a mitotic cell and a GO/G1 cell ${ }^{11-13,29,35}$. Any such mechanism should conform to/explain a number of features of HeH ALL genomes: (1) the specific pattern of trisomies, tetrasomies, and low-level UPIDs, including why 2:2 tetrasomies are much more common than 3:1 tetrasomies, (2) the presence not only of the common trisomies but also of gains (at low frequency) of all chromosomes, (3) the relative chromosomal stability shown by our scWGS analysis, and (4) that strong-pos and weak-pos chromosomes are on average newer (occur later during leukemogenesis) than neg chromosomes, as evidenced by our analysis of B/ATRI and ATRI mutations. To test which of the proposed mechanism(s) that conformed to the first of these features, we performed in silico modelling (excluding the fusion model since its outcome could not be statistically predicted) and compared the outcome with the chromosomal patterns seen in a large cohort of HeH ALL. We found that an initial tripolar mitosis that leads to gain of the bulk of the extra chromosomes, followed by clonal evolution over multiple generations of cells, recapitulated the chromosomal and allelic patterns seen in the patient samples. Furthermore, this mechanism can also explain why the low frequency trisomies occur, as they are passenger events that are gained in the initial tripolar division, as well as why they are on average older than the high frequency trisomies, which may also arise and be fixated later due to positive selection pressure. Finally, the diploid/tripolar model does not require chromosomal instability for aneuploidy to occur within a reasonable (considering the young age of the patients) time frame, as the bulk of the chromosomal gains occur very early (also in line with previous data showing hyperdiploidy years before overt diagnosis of HeH ALL ${ }^{6-10}$ ). Notably, tripolar cell divisions have been reported to occur in cancer and lead to viable daughter cells ${ }^{4,36}$ that potentially could regain mitotic stability by clustering or loss of supernumerary centrosomes. Thus, no evidence of this initial mitotic error apart from the allelic patterns would still be visible at the time of diagnosis.

The punctuated evolution model in cancer states that somatic aberrations arise in short bursts of time very early in tumour evolution ${ }^{1}$. By scWGS, all cases showed phylogeny in line with this, with few intermediate cells indicating gradual evolution, long truncal distances, and short branching distances (Supplementary Fig. 3). The diploid/tripolar model that we suggest underlies the extra chromosomes in HeH ALL is a clear example of a way that such punctuated evolution for whole chromosome copy number changes could occur. Our results thus support previous studies showing frequent punctuated evolution for copy number changes in malignancies ${ }^{3,4}$.

We found a possible difference in the chromosome distribution in HeH cases with MCN 62-67. Heerema et al. ${ }^{37}$ reported that cases with MCN 63-67 have different chromosomal gains than HeH ALL with lower MCN, in line with them being a separate entity genetically. Furthermore, we and others have previously shown that cases with higher MCN have a significantly better prognosis ${ }^{38,39}$, indicating that they also differ clinically. However, it should be noted that due to the rarity of cases with MCN in this span, we cannot exclude that the observed differences in chromosome distribution were due to chance only. Both a diploid/tripolar and a tetraploid/sequential mechanism agreed relatively well with the chromosomal patterns in the patient cohort, and further studies are needed to ascertain how HeH ALL with MCN 62-67 arises.

In conclusion, we present a model for the leukemogenesis of HeH paediatric ALL where most cases are initiated by an erroneous tripolar mitosis, after which they undergo low-level clonal evolution to optimize their chromosomal pattern and gain additional driver events that eventually leads to overt leukaemia several years later. This model agrees well with a wealth of previous observations, including the early
occurrence of the chromosomal gains ${ }^{6-10}$, chromosomal and allelic patterns ${ }^{11-13}$, and general genomic stability ${ }^{5,26,28}$ in this disease. Furthermore, it strengthens the evidence that copy number changes and aneuploidy frequently arise by punctuated evolution at the early stages of tumorigenesis and that aneuploidy-driven malignancies do not necessarily have high levels of chromosomal copy number heterogeneity and CIN.

## Methods

## Single cell WGS

All investigations complied with relevant ethical regulations. Written informed consent was obtained from the patients and/or their guardians according to the Declaration of Helsinki and the study was approved by the Ethics Committee of Lund University, Sweden. No monetary compensation was offered for patient participation. Viable bone marrow cells obtained at diagnosis from nine patients with high hyperdiploid ALL and one healthy individual, selected on the basis of sample availability, were subjected to low-pass scWGS. Single nuclei in $\mathrm{G}_{0} / \mathrm{G}_{1}$ phase were isolated using a fluorescence-activated cell sorting (FACS) cytometer and DNA libraries were constructed for multiplexed whole genome sequencing with average sequencing depth between $0.006 x$ to $0.089 x$ per cell (median $0.02 x)^{40}$. Sequencing reads were aligned to the UCSC human reference genome (hg19, [http:// hgdownload.cse.ucsc.edu/goldenPath/hg19/bigZips/]) using the Burrows-Wheeler Aligner (BWA, v0.7.17) ${ }^{41}$. The aligned reads were sorted and merged with SAMtools (v1.9) ${ }^{42}$. The copy number state of each chromosome was determined using AneuFinder ( v 1.14$)^{32}$. Briefly, duplicate reads, low-quality alignments (MAPQ $<20$ ), and reads falling into the regions specified by the blacklists provided by AneuFinder were discarded. Read counts in $2.5 \mathrm{Mb}, 5 \mathrm{Mb}$, and 10 Mb variable-width bins were GC-corrected and copy number states were determined using the edivisive algorithm with copy-number states nulli-, mono-, di-, tri-, tetra-, penta-, and hexasomy. The copy number state was also determined by Ginkgo ${ }^{43}$ using default settings with a bin size of 1 Mb . All data were manually curated and in the final heatmaps, breakpoints were aggregated depending on supportive data from WGS, SNP array, and FISH. scWGS phylogenetic trees were constructed using MEDICC2 ${ }^{44}$ and subsequently manually curated to accommodate structural rearrangements by combining scWGS, WGS, SNP array, and FISH results for some cases. Pairwise distances of single cells and simulated normal diploid cells were calculated using Manhattan distance by R (version 4.1.2) to obtain a distance matrix for each tumour. Phylogenetic inference for single cell trees and consensus trees were performed with the balanced minimum evolution algorithm from R package ape $(v 5.6)^{45}$. Normal diploid nodes for phylogenetic tress were constructed from simulated variable binning profiles in which bins presented an integer copy number equal to 2 for autosomes and $1 / 2$ for chromosome $X$ depending on patient sex. Clones were defined as $\geq 2$ cells presenting with the same numerical and/or structural aberrations. Genome-wide heterogeneity scores were obtained from AneuFinder. Homologue inheritance of chromosomes gained or lost was determined by screening for heterozygous variants identified from bulk WGS data. Briefly, heterozygous variants were called by GATK (v4.0.11.0) haplotypecaller ${ }^{46}$ and the variants from trisomies and tetrasomies of 3:1 type and UPIDs were extracted. For trisomies/tetrasomies 3:1, heterozygous variants were assigned to different homologues based on the alternative allele frequency obtained from bulk WGS data. Variants with alternative allele frequency higher than 0.6 were assigned to one chromosomal homologue and variants with alternative allele frequency less than 0.4 were assigned to the other. For UPIDs that were found in diagnostic samples, remission-specific variants from the same chromosome were assigned to one chromosomal homologue and variants that showed heterozygosity in the remission sample but homozygosity in the matched diagnostic sample were assigned to the other homologue. Then variants informative for
chromosomal homologue were screened in scWGS data and the homologue inheritance of chromosomes gained or lost was determined by the ratio between the number of each type of variant in the single cells.

## Copy number analysis of bulk data

Log R ratio (LRR) and B allele frequency (BAF) of SNP array data from Illumina (idat files) and Affymetrix (.CEL files) intensity files were analyzed by Illumina GenomeStudio (v2.0, Illumina, San Diego, CA) and Affymetrix Analysis Power Tools (v2.10.0, Thermo Fisher Scientific Inc., Waltham, MA), respectively. Copy number alterations were called using TAPS ${ }^{47}$ and manually reviewed in GenomeStudio or Chromosome Analysis Suite (v3.3, Thermo Fisher Scientific Inc., Waltham, MA). Subclonality of whole chromosomes was assessed using the TAPS software from SNP array, WES, or WGS data, considering LRR, BAF, and tumour purity. Depending on the type of subclonality (disomy/trisomy, UPID/trisomy, etc.), the lower limit of detection of subclones was estimated to $20-30 \%$ of the cells. The dataset included four different cohorts: from our Department ${ }^{26}$, Zaliova et al. ${ }^{48}$, Duployez et al. ${ }^{49}$, and The Therapeutically Applicable Research to Generate Effective Treatments (TARGET) program (dbGAP accession number phs00464) (Supplementary Data 1). Of those 577 cases, 253 (44\%) were females and 324 (56\%) were males, based on the absence or presence of a $Y$ chromosome.

For WES data from TARGET, paired-end reads were aligned to the human reference genome hg19 by the bwa ${ }^{41}$. Duplicate reads marking and local realignment were performed by GATK ${ }^{46}$. Constitutional variants of matched tumour/normal pairs were called by GATK HaplotypeCaller and the bedtools ( v 2.27 .1 ) intersect was used to extract the variants in the regions targeted by the exome sequencing kit. After normalizing read counts of constitutional mutation sites to the sequencing depth, the LRR of the constitutional variants was then calculated by the log-odds ratio of the variant allele count in the tumour versus in the normal. Reference allele frequency of constitutional variant sites was defined by the reference allele count versus total sequencing depth of the constitutional variant site in the tumour sample.

Paired diagnostic and relapse samples have been previously published ${ }^{16}$ or were from TARGET. To investigate the chromosomal homologue involved in paired diagnostic and relapse samples, heterozygous variants from trisomies and tetrasomies $3: 1$ were extracted and assigned to different homologues based on the BAF of the diagnostic sample. Variants with BAF higher than 0.6 were assigned to one chromosomal homologue and variants with BAF less than 0.4 were assigned to the other. Then variants informative for chromosomal homologues were screened in the relapse sample to determine the involved chromosomal homologue. For UPIDs that were found in diagnostic samples, variants with BAF higher than 0.8 were screened in the paired relapse sample and homologue inheritance of chromosomes was determined by the BAF of corresponding variants in the relapse sample.

## WGS data analysis and identification of BTRI and B/ATRI mutations

WGS data from 14 BCP ALL cases have been previously published ${ }^{10}$. The initial putative somatic mutations were identified by the Complete Genomics Cancer Sequencing pipeline and the data were further filtered for Somatic Score $\geq 0$ and number of unique reads for the mutated allele $>10$. For Complete Genomics data generated by the TARGET program $(n=34)$, somatic variants were identified by the TARGET WGS analysis pipeline ([https://ocg.cancer.gov/programs/ target/target-methods\#3233]). Illumina WGS sequencing libraries of nineteen matched diagnostic and remission bone marrow or peripheral blood samples diagnosed at Skåne University Hospital, Sweden, were constructed by the TruSeq Nano DNA sample preparation kit
(Illumina, San Diego, CA, USA). Paired-end sequencing ( $2 \times 150 \mathrm{bp}$ ) was done to $\sim 60 x$ coverage for diagnostic samples and $\sim 30 x$ coverage for remission. Somatic variants were identified by the GDC DNA-Seq analysis pipeline ([https://docs.gdc.cancer.gov/Data/Bioinformatics_ Pipelines/DNA_Seq_Variant_Calling_Pipeline/]). Whether mutations occurred before (BTRI) or before/after (B/ATRI) trisomy formation were determined by mutant allele fractions according to Paulsson et al. ${ }^{10}$. Driver genes/mutations were identified by MutsigCV ${ }^{50}$ and DriverPower ${ }^{51}$. A literature review focusing on genes identified by bulk WGS sequencing as targeted by non-silent somatic mutations associated with the search terms "aneuploidy", "instability" and "cohesin" was performed in order to investigate whether mutations in genes affecting genomic stability were responsible for the heterogeneity observed within the nine scWGS cases.

## Mutational signatures analysis

The R package MutationalPatterns ${ }^{52}$ (v3.4.1) was used to decompose mutational profiles into pre-defined single base substitution (SBS) mutational signatures based on the Sanger mutational signatures (v3.2 - March 2021) and to ascertain the relative contributions of the SBS mutational signatures for BTRI and B/ATRI mutations in trisomic chromosomes at diagnosis, and all informative relapse-specific mutations.

## Cohesion assay and FISH

Sister chromatid cohesion was analyzed in metaphase spreads in all nine HeH ALL patient samples subjected to scWGS. The percentage of cells with cohesion defects, measured as visible primary constriction gaps (gaps between the sister chromatids at the centromeres) ${ }^{14}$, was counted. FISH metaphase spreads mounted with DAPI were used for the assay, where 20-39 cells were analyzed per case. Images were captured using a Z2 fluorescence microscope (Zeiss, Germany) and the CytoVision software (v7.4, Leica, Germany).

Metaphase FISH was carried out on cases 2, 3, and 4 according to standard methods, with a total of 17-35 cells captured for each analysis. All whole chromosome paint FISH probes were acquired from Applied Spectral Imaging (Carlsbad, CA), and locus-specific probes from Vysis (Abbot Laboratories, Chicago, IL). FISH analysis was performed as follows: slides from case 2 were hybridized with whole chromosome paint probes for chromosomes 1 (Aqua - blue), 6 (Cy3 - red), and 21 (FITC green); for case 3, whole chromosome paint probes for chromosomes 1 (FITC) and 16 (Aqua) were used together with a telomeric probe for $16 q$ (Cy3); and for case 4, one analysis was performed with whole chromosome paint probes for chromosomes 3 (FITC) and 6 (Cy3), and another analysis for chromosome 14 (Aqua) together with a LSI TRA/D (14q11.2) break-apart dual colour probe (Cy3/FITC).

## Simulation of high hyperdiploidy development

To investigate the development of aneuploidy observed in HeH ALL, we constructed an algorithm to simulate the clonal expansion and to trace single-cell karyotypes over two thousand generations using the Python programming language (v2.7.15). For each model, 50,000 virtual cells were created and the copy number of individual chromosomes was defined according to the initial hit based on the simulation model: sequential gains in a diploid cell (diploid/sequential), initial tetraploidy followed by chromosomal losses (tetraploid/sequential), tripolar division in a tetraploid cell (tetraploid/tripolar), tripolar division in a diploid cell (diploid/tripolar), and mitotic catastrophe (mitotic catastrophe). For simplicity, all scenarios started with $46, \mathrm{XX}$ cells (the $Y$ chromosome was not included in the analysis). All virtual cells were represented by a $23 \times 50,000$ matrix. For the virtual cells $\left(C_{g}\right)$ at generation $g, C_{g}(i)$ was the copy number of a virtual cell for each of the 23 chromosomes indexed by $i$. During cell division, two daughter cells would be formed from the mother cell. The missegregation rate ( $M_{\text {misseg }}$ ) was set to ( $15 \times 10^{-4} /$ chromosome/
mitosis) ${ }^{53}$ and the probability of missegregation ( $P_{\text {misseg }}$ ) of each chromosome was weighted by the copy number of the given chromosome $(N)$ and $P_{\text {misseg }}=M_{\text {misseg }} N$. Only one missegregation event of any given chromosome in a single cell division was allowed and the missegregated chromosome was randomly assigned to one of the two daughter cells. For tetraploid/sequential, the probability of chromosome loss was set to $35 \%$ according to previously published data ${ }^{54}$. Virtual cells with nullisomy were excluded from subsequent generations. Clonal expansion of virtual cells was altered by positive and negative selection of gain/loss of certain chromosomes. In the algorithm, we employed a survival/proliferation score $\left(S_{\text {score }}\right)$ to determine the survival probability of virtual cells. Normal diploid cells were given a probability of $50 \%$ for proliferative survival. The $S_{\text {score }}$ of the virtual cell was determined according to its karyotype. Virtual cells with trisomies $X, 4,6,10,14,17$, and 18 (group 1) and gain of chromosome 21 (group 2) were subjected to positive selection, whereas virtual cells with gain/loss of the remaining chromosomes (group 3) were subjected to negative selection. In addition, virtual cells were also subjected to negative selection pressure (aneuploidy penalty score, $S_{\text {aneuploidy }}$ ), which increased with the modal number of chromosomes $(M C N>46)$ of that cell. The $S_{\text {score }}$ of the given virtual cell was computed according to:

$$
\begin{equation*}
S_{\text {score }}=0.5+\frac{N T_{g 1}+2 N T_{g 2}-N T_{g 3}}{23}-S_{\text {aneuploidy }} \tag{1}
\end{equation*}
$$

where $N T_{g 1}$ is the number of trisomic chromosomes in group $1, N T_{g 2}$ is the number of trisomic chromosomes in group 2 and $N T_{g 3}$ is the number of trisomic chromosomes in group 3. The $S_{\text {aneuploidy }}$ was calculated by using the probability density function of beta distribution from python scipy package (https://docs.scipy.org/doc/scipy/ reference/generated/scipy.stats.beta.html) with the empirically determined location parameter loc 0 , scale parameter scale 1.8 , shape parameters a and b $0.18,0.65$, respectively. The $x$ parameter was defined as:

$$
\begin{equation*}
x=\frac{M C N-46}{46} \tag{2}
\end{equation*}
$$

For the tetraploid/sequential model, no $S_{\text {aneuploidy }}$ was used since no initial tetraploid cell would survive under that condition.

In addition, an extended version (four groups version) of $S_{\text {score }}$ was also used by dividing group 3 into two groups: one with negative selection for gain of chromosomes $1-3,7,9,13,15,16,19$, and 20 (group 3b) and the other one with weak positive selection for gain of chromosomes 5, 8, 11, 12 and 22 (group 4). Then the $S_{\text {score }}$ of the given virtual cell was computed according to:

$$
\begin{equation*}
S_{\text {score }}=0.5+\frac{N T_{g 1}+2 N T_{g 2}+0.02 N_{g 4}-N T_{g 3 b}}{23}-S_{\text {aneuploidy }} \tag{3}
\end{equation*}
$$

where $N T_{g 3 b}$ is the number of trisomic chromosomes in group 3 b and $N T_{g 4}$ is the number of trisomic chromosomes in group 4. To save the computational memory requirements for exponential cell growth, virtual cells that died were removed from subsequent generations and 50,000 cells were randomly sampled into subsequent generations. If the number of virtual cells was less than 50,000, cells with aneuploid karyotypes were drawn from the pre-defined model and added to the current generation. Simulations were stopped when the UPID frequency of chromosomes $1-3,5,7-8,11-13,15,16,19,20$, and 22 became $2.5 \%$ or terminated after 2000 generations. Fifty parallel runs were performed for each model. After the end of the simulation, one million virtual cells were randomly sampled from each model and the karyotype similarity between the patient cohort and sampled cells was measured using the RMSE method.

To investigate whether the aneuploidy developed by punctuated or gradual evolution in the diploid/tripolar and diploid/sequential models, ten thousand virtual cells were randomly sampled from each simulated generation and the corresponding median modal chromosome number was calculated. One hundred parallel runs were performed and smoothing regression analysis (LOESS) was used to model the relationship between the modal chromosome number and the number of generations.

## Statistics and reproducibility

For assessing technical reproducibility, bulk WGS data from technical replicates represented by independent next generation sequencing libraries from the same DNA of 2 HeH samples (case L31 and case L74) were generated. A high correlation between the results from the two replicates was observed and over $97 \%$ of mutation sites were identified in the replication datasets. Since the reproducibility was very high, no additional replicates were generated. No statistical method was used to predetermine sample size. All cases with HeH where SNP array/ WGS/WES data were available were included in the bulk copy number analysis, except for samples where the technical quality was too poor. The sister chromatid cohesion assay and the copy number variation calling were performed independently in a blinded fashion. All statistical tests were performed in R (version 4.1.2). The detailed statistical tests are indicated in figures or associated legends where applicable. No data were excluded from the analyses. None of the statistical tests used in this study required the assumption of normality or the assumption of equal variance. $P$ values were calculated based on nonparametric tests that do not have degrees of freedom associated with a sampling distribution. A significance threshold of $<0.05$ was used for all statistical tests.

## Reporting summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

## Data availability

The scWGS data generated in this study have been deposited in the European Genome Archive (EGA) under accession number EGAS00001006347. The scWGS dataset is available under restricted access due to privacy concerns; access can be obtained for academic research by contacting the Data Access Committee via EGA. The processed somatic SNP array data and bulk WGS data are freely available through the following DOIs: https://doi.org/10.17044/scilifelab. 21953114 (SNP array dataset) and https://doi.org/10.17044/scilifelab. 21953117 (bulk WGS dataset). The raw SNP array data and bulk WGS data generated during the current study have been deposited to EGA under accession numbers EGAS00001007049 and EGAS00001007052, respectively. These datasets are available under restricted access due to privacy concerns; access can be obtained for academic research by contacting the Data Access Committee via EGA. The WGS data generated by the Therapeutically Applicable Research to Generate Effective Treatments (TARGET) are available under accession code phs000464. The human reference GRCh37 (hg19) used in this study is available in the UCSC Genome Browser [http:// hgdownload.cse.ucsc.edu/goldenPath/hg19/bigZips/]. Source data are provided with this paper.

## Code availability

The code used to perform the analysis is available as supplementary code, also available on Zenodo ${ }^{55}$.

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## Author contributions

E.L.W., M.Y., and K.P. conceived the study; E.L.W., M.Y., L.H.M.-C., H.v.d.B., R.G., L.O.-A., and D.C.J.S. performed experiments and analyzed data; A.C., N.D., M.Z., J.Z., and B.J. provided clinical data and samples and analyzed data; F.F. supervised experiments and analyzed data; K.P. supervised the study; E.L.W., M.Y., and K.P. wrote the article with input from all authors.

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## Competing interests

The authors declare no competing interests.

## Additional information

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## SUPPLEMENTARY INFORMATION FOR

## Clonal origin and development of high hyperdiploidy in childhood acute lymphoblastic leukemia

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Supplementary Table 1. Patient and genetic data for nine cases of high hyperdiploid childhood acute lymphoblastic leukemias subjected to single cell whole
genome sequencing

| Case | Gender | Karyotype ${ }^{\text {a }}$ | No. of somatic mutations | Genes targeted by non-silent somatic mutations | Other somatic changes |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | M | 56,XY, +X, +Y,dup(1)(q21q32),+4,+6,+10,+14,+17,+18,+21,+21 | 1,045 | CCDC63, MARVELD2, MRAP2, NPAS3, NRAS, OR1D5, SCN4A, TLN2 |  |
| 2 | M | 56,XY, +X, dup(1)(q21q41), +4,+6,+8,+10,+14,+17,+18,+21,+21 | 1,005 | AC012593.1, BEND5, FLT3, GIF, PCDHGA5, RBFOX1, RP11347L18.1, SLC7A4, SULF1 | Focal ETV6 deletion |
| 3 | M | $\begin{aligned} & 66, X Y,+X, \operatorname{dup}(1)(q 21 q 44) \times 2,+3,+4,+5,+6,+8,+9,+10,+10,+11,+12 \\ & 13, \text { del(13)(q21q31),+14,+14,+16,+16, del(16)(p12)x2,+17,+18,+18, } \\ & +21,+21 \end{aligned}$ | 1,043 | ATP8A2, CNTN1, HYDIN, NAV3, NOC2L, POLR3E, ROBO2, SPATA31D1, TCP10, TCTN3, TEKT4, TSEN34, UGT8 |  |
| 4 | F | $\begin{aligned} & 57, X X,+X,+X, \operatorname{der}(3) t(3 ; 6)(q 29 ; q 22),+4,+8,+10,+14,+\operatorname{del}(14)(q 12),+17 \\ & +18,+21,+21 \end{aligned}$ | 1,108 | CDKN2A, DPP10, GPR4, HSPG2, HUWE1, IKZF1, LL22NCO181G9.3, PCDH15, TBR1, TEX28, ZSCAN16 |  |
| 5 | M | $\begin{aligned} & \text { 57,XY,+X,+del(5)(q23),+6,del(7)(q34),+10,+dup(14)(q11q22), } \\ & + \text { del(16)(p13),+17,+18,+21,+21,+mar } \end{aligned}$ | 1,857 | ADAM12, AKAP6, COL4A6, CREBBP, DSCAML1, FLT3, HSD3B2, KLHL36, LAMA1, MAOA, MAPK4, MUC16, MUC17, MYPN, OTOA, PCSK6, RNF130, STON1-GTF2A1L, SULT1B1, TEP1, TGM2, TRRAP, TUBA4A, UBA6, ZNF804A | UPID11, UPID13, subclonal focal ETV6 deletion |
| 6 | M | $54, X Y,+X,+4,+6,+9,+10,+18,+21,+21$ | 837 | ACOT1, DOT1L, FLT3, KRAS, SIGLEC1, STOX2, TENM3 |  |
| 7 | F | 54, XX, +X, +4, +6,+14,+17,+18,+21,+21 | 1,632 | ADH7, AR, ATF7IP, DHCR7, FAM27E1, FAM27E3, GATA5, GRIK2, HYDIN, KRAS, NRAS, OR56A1, PADI1, PTPN11, TBPL2, WDHD1 | Focal PAX5 deletion |
| 8 | M | 51,XY, +X, +4, +14, +21,+21 | 822 | CILP, F11, FAM81A, FLT3, GATA1, HSF5, KCNH7, MATN3, PTK2 |  |
| 9 | M | 56, XY , +X, +4, +4, +8,+14,+17,+18,+21c,+21,+21 | 1,734 | APOL3, CAMLG, CREBBP, CSMD3, CTD-2128A3.2, DNTT, FN1, IFT122, KRAS, LPHN3, LRP3, LUC7L, M1AP, MYB, PRICKLE2, RP11-763F8.1, SGOL1, SMARCD1, THSD4, TNPO2, ZAR1L |  |

${ }^{\text {a Based on G-banding and SNP array analysis on bulk DNA }}$
Abbreviations: F, female; M, male; UPID, uniparental isodisomy
Supplementary Table 2. Subclonality involving whole chromosomes in 577 cases of high hyperdiploid pediatric acute lymphoblastic leukemia

| Chromosome | No of cases with subclonality (\%) | Type of subclonality (No of cases) |  |  |  |  |  |  |  |  |  | $P$ disomy vs UPID ${ }^{\text {a }}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Trisomy/ disomy | Trisomy/ UPID | Trisomy/ tetrasomy 2:2 | UPID/ disomy | Disomy/ tetrasomy 2:2 | Disomy/ monosomy | Tetrasomy 2:2/ pentasomy | Trisomy/ tetrasomy 3:1 | XXY/XX0 | XY/X0 |  |
| 1 | 2 (0.35) | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 |  |
| 2 | 3 (0.52) | 3 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.593 |
| 3 | 5 (0.87) | 5 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.263 |
| 4 | 9 (1.6) | 7 | 2 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.754 |
| 5 | 4 (0.69) | 3 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 |
| 6 | 10 (1.7) | 9 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.208 |
| 7 | 6 (1.0) | 3 | 3 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.639 |
| 8 | 26 (4.5) | 20 | 3 | 2 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0.0529 |
| 9 | 50 (8.7) | 26 | 22 | 0 | 1 | 0 | 1 | 0 | 0 | 0 | 0 | 0.0969 |
| 10 | 14 (2.4) | 9 | 2 | 3 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.468 |
| 11 | 10 (1.7) | 6 | 2 | 0 | 0 | 1 | 1 | 0 | 0 | 0 | 0 | 0.936 |
| 12 | 5 (0.87) | 4 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.922 |
| 13 | 5 (0.87) | 2 | 0 | 0 | 0 | 0 | 3 | 0 | 0 | 0 | 0 | - |
| 14 | 8 (1.4) | 2 | 1 | 5 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 |
| 15 | 5 (0.87) | 2 | 3 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.420 |
| 16 | 7 (1.2) | 5 | 2 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 |
| 17 | 10 (1.7) | 6 | 3 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 |
| 18 | 7 (1.2) | 0 | 0 | 7 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | - |
| 19 | 0 (0) | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | - |
| 20 | 1 (0.17) | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | - |
| 21 | 21 (3.6) | 1 | 0 | 9 | 0 | 0 | 0 | 5 | 6 | 0 | 0 | - |
| 22 | 3 (0.52) | 2 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | - |
| X females | 13 (5.1) | 1 | 10 | 1 | 0 | 0 | 0 | 1 | 1 | 0 | 0 | 0.000260 |
| X males | 0 (0) | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | - |
| Y | 4 (1.2) | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 3 | 1 | - |
| Sum | - | 117 | 56 | 28 | 1 | 2 | 6 | 6 | 8 | 3 | 1 | 0.872 |

[^7]Supplementary Table 3. RMSE values between simulation result and 577 cases of high hyperdiploid pediatric acute lymphoblastic leukemia

| UPID frequency at the end of simulation | Modal chromosome number | Comparison group | Trisomy/tetrasomy at different chromosome modal numbers ${ }^{\text {a }}$ | Trisomy/tetrasomy distribution similarity |
| :---: | :---: | :---: | :---: | :---: |
| 2.5\% | 51-61 | Diploid/sequential vs cases | 0.81 / 0.37 | 0.10 / 0.11 |
|  |  | Tetraploid/sequential vs cases | NA / NA ${ }^{\text {b }}$ | NA / NA ${ }^{\text {b }}$ |
|  |  | Diploid/tripolar 3 groups vs cases | 0.35 / 0.27 | $0.087 / 0.035$ |
|  |  | Diploid/tripolar 4 groups vs cases | 0.27 / 0.19 | 0.075 / 0.035 |
|  | 62-67 | Tetraploid/sequential 3 groups vs cases | 0.25 / 0.83 | 0.341 / 0.163 |
|  |  | Tetraploid/sequential 4 groups vs cases | 0.23 / 0.776 | 0.339 / 0.166 |
|  |  | Diploid/tripolar 3 groups vs cases | 0.61 / 0.94 | 0.325 / 0.138 |
|  |  | Diploid/tripolar 4 groups vs cases | 1.10 / 0.779 | 0.271 / 0.128 |
| 5.0\% | 62-67 | Tetraploid/sequential 3 groups vs cases | 0.22 / 0.81 | 0.34 / 0.162 |
|  |  | Tetraploid/sequential 4 groups vs cases | 0.21 / 0.79 | 0.339 / 0.166 |
|  |  | Diploid/tripolar 3 groups vs cases | 0.47 / 0.81 | 0.324 / 0.136 |
|  |  | Diploid/tripolar 4 groups vs cases | 1.7 / 0.71 | 0.275 / 0.13 |

${ }^{\text {a }}$ The smallest RMSE values are shown in bold
${ }^{\text {b }}$ Lack of required virtual cell numbers for RMSE value calculation
Abbreviations: NA, not applicable; RMSE, root mean squared error; UPID, uniparental isodisomy
Supplementary Table 4. Frequency and pattern of structural rearrangements, targeted deletions, and mutations in high hyperdiploid childhood acute ymphoblastic leukemia

| Somatic aberration | Total no. (\%) | No. of clonal (\%) | No of subclonal (\%) | Occurred before chromosomal event, no (\%) | Occurred after chromosomal event, no (\%) |
| :---: | :---: | :---: | :---: | :---: | :---: |
| dup(1q) | 140/577 (24) | 82 (59) | 58 (41) | 0/8 (0) | 8/8 (100) |
| del(6q) | 25/577 (4.3) | 15 (60) | 10 (40) | 0/22 (0) | 22/22 (100) |
| i(7q) | 15/577 (2.6) | 14 (93) | 1 (6.7) | N.I. | N.I. |
| Partial 17q gain | 54/577 (9.4) | 38 (70) | 16 (30) | N.I. | N.I. |
| IKZF1 del ${ }^{\text {a }}$ | 23/427 (5.4) | 20 (87) | 3 (13) | N.I. | N.I. |
| CDKN2A del | 53/427 (12) | 42 (79) | 11 (21) | 1/16 (6.3) | 15/16 (94) |
| PAX5 del | 19/427 (4.4) | 14 (74) | 5 (26) | 0/1 (0) | 1/1 (100) |
| ETV6 del | 45/427 (11) | 27 (60) | 18 (40) | 1/9 (11) ${ }^{\text {b }}$ | 8/9 (89) |
| CREBBP del | 10/427 (2.3) | 8 (80) | 2 (20) | 0/1 (0) | 1/1 (100) |
| TCF3 del | 10/427 (2.3) | 9 (90) | 1 (10) | N.I. | N.I. |
| CREBBP mut | 21/218 (9.6) | 12 (57) | 9 (43) | N.I. | N.I. |
| FLT3 mut | 32/218 (15) | 15 (47) | 17 (53) | 0/2 (0) | 2/2 (100) |
| IKZF1 mut | 8/218 (3.7) | 3 (38) | 5 (62) | 1/1 (100) | 0/1 (0) |
| KRAS mut | 61/218 (28) | 31 (51) | 30 (49) | 0/4 (0) | 4/4 (100) |
| NRAS mut | 50/218 (23) | 21 (42) | 29 (58) | 0/1 (0) | 1/1 (100) |
| PTPN11 mut | 14/218 (6.4) | 7 (50) | 7 (50) | 0/1 (0) | 1/1 (100) |
| Other mut | 155 | 102 (66) | 53 (34) | 4/56 (7.1) | 52/56 (93) |

[^8]${ }^{\text {a }}$ Includes cases with loss of IKZF1 through isochromosome 7q and monosomy 7
${ }^{\mathrm{b}}$ Constitutional ETV6 deletion


Supplementary Figure 1. Trisomy 17 homologue-specific analysis of scWGS data in case 9, showing gain of homologue 1 in 19 cells and of homologue 2 in 201 cells. Abbreviations: SNV, single nucleotide variant. Source data are provided as a Source Data file.


Supplementary Figure 2. Spearman's rank correlation between the number of sequenced cells and the numerical and structural heterogeneity scores. No correlation was seen ( $P=0.32$; Spearman's correlation two-sided test). Source data are provided as a Source Data file.


Supplementary Figure 3. Minimum evolution trees of single cell copy number data for nine primary high hyperdiploid childhood acute lymphoblastic leukemia cases. Trees are rooted by simulated normal diploid cells and only the copy number events that were observed in at least two single cells were used. All cases showed relatively long truncal and relatively short branching distances, agreeing with a punctuated evolution model for copy number changes in these malignancies. Source data are provided as a Source Data file.


Supplementary Figure 4. Complex patterns of copy number changes involving structural rearrangements in high hyperdiploid ALL cases as elucidated by fluorescence in situ hybridization; in the schematic drawings, different shades of each color represent different homologues. Twenty to thirty-nine metaphase cells were independently analyzed for each case, with percentages of cells corresponding to each subclone shown in the figure. A) Multiple rearrangements involving chromosome 16 in case 3. A traumatic event likely caused breakage in two different chromosomes 16 (at 16p12.2 and 16q) in a cell with tetrasomy 16 as well as two separate gains of 1q, resulting in three subclones with different chromosome 1 and 16 rearrangements. B) Chromosome 14 rearrangements in case 4. Two events of loss of $14 q$ resulted in three subclones with a tetrasomy 14, three normal copies of chromosome 14, and an add(14)(q12), and two normal copies of chromosome 14 and two identical add(14)(q12), respectively. Abbreviations: TEL16q, telomere 16q; WCP, whole chromosome paint. Schematics created with BioRender.com.


Supplementary Figure 5. Gain of each chromosome per modal number. Source data are provided as a Source Data file.


Supplementary Figure 6. SNP array analysis of a dilution series with 0-100\% leukemic cells. The series was made using a leukemic sample with close to $100 \%$ leukemic blast cells and its corresponding remission sample, with $0 \%$ blast cells. Results are from TAPS ${ }^{1}$ and graphs show the allelic imbalance versus the log2 ratio. Signals from chromosomes 9 (disomic), 10 (trisomic) and 11 (uniparental isodisomy; UPID) are shown in red. The legend shows where the signal from chromosomes with a specific copy number clusters in the pure leukemic sample. UPID11 can be detected at $20 \%$ and trisomy 10 at $30 \%$ leukemic cells, corresponding to these clone sizes. The dilution series SNP array data have previously been published in Paulsson et al. ${ }^{2}$ Abbreviations: UPID, uniparental isodisomy; UPIT, uniparental isotrisomy.


Supplementary Figure 7. Schematics of how subclonal populations may arise. The top panel shows how heterodisomy/trisomy could arise either by an initial disomy becoming a trisomy or vice versa, i.e. the direction of the change cannot be inferred. The bottom panel shows that uniparental isodisomy(UPID)/trisomy can only arise from initial trisomy by loss of one chromosomal homologue. Here, $2 / 3$ cells become heterodisomies and $1 / 3$ cells becomes a UPID. Abbreviations: UPID, uniparental isodisomy. Created with BioRender.com.

Supplementary Figure 8. Schematics of how five different models for hyperdiploidy development will lead to different patterns of tetrasomies $2: 2$ and $3: 1$ and uniparental isodisomies. Abbreviations: c, copy/copies; UPID, uniparental isodisomy. Created with BioRender.com.


Supplementary Figure 9. Uniparental isodisomy (UPID) frequencies and distribution of modal chromosome numbers (MCN). A. UPID frequencies for groups weak pos and neg chromosomes over 2,000 generations in each simulation model. Thick lines show the generalized additive model regression of UPID frequencies of all simulations and thin lines show the UPID frequencies of 15 randomly selected simulations. The diploid/tripolar and diploid/sequential models reached $2.5 \%$ UPIDs after 50-800 generations, consistent with the patient data. B. Distribution of MCN in the patient cohort and in the five simulation models. All simulation models but the tetraploid/sequential model resulted in a similar MCN distribution to the patient cohort. The tetraploid/sequential model resulted in very few cells that had MCN 51-67; most of the virtual cells showed MCN around 75. Abbreviations: UPID, uniparental isodisomy. Source data are provided as a Source Data file.


Supplementary Figure 10. Models of chromosome copy number evolution during high hyperdiploidy development. The LOESS-smoothed lines show the correlation between the average modal chromosome number (Y axis) and the number of simulated generations (X-axis) of 100 randomly sampled simulation results from the diploid/sequential model and diploid/tripolar model. The gray ribbon shows the $95 \%$ confidence intervals of the loess-smoothed line. An initial burst of whole chromosome gain events was observed in the diploid/tripolar model. These events were followed by a period of transient instability and stable expansions during the high hyperdiploidy development, in line with the punctuated copy number evolution model. In the diploid/sequential model, chromosomes were acquired sequentially throughout high hyperdiploidy development, indicating gradual copy number evolution. Abbreviations: LOESS, locally weighted scatterplot smoothing. Source data are provided as a Source Data file.


Supplementary Figure 11. Fraction of BTRI mutations (occurring before the shift to three copies) in dup(1q) compared with trisomies in the same cases. The fraction of BTRI mutations is significantly higher in $\operatorname{dup}(1 q)\left(P=4.9 \times 10^{-4}\right.$; Mann-Whitney two-sided test), indicating that this rearrangement is formed subsequently to the trisomies. The centre of the boxplot is the median and lower/upper hinges correspond to the first/third quartiles; whiskers are 1.5 times the interquartile range and data beyond this range are plotted as individual points. Source data are provided as a Source Data file.

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# "Still round the corner there may wait A new road or a secret gate, And though we pass them by today, Tomorrow we may come this way And take the hidden paths that run Towards the Moon or to the Sun." <br> "Home behind, the world ahead, And there are many paths to tread Through shadows to the edge of night, Until the stars are all alight Then world behind and home ahead, We'll wander back to home and bed." 

The Fellowship of the Ring, Book 1, Chapter 3,

J. R. R. Tolkien


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[^2]:    Abbreviations: F, female; HeH, high hyperdiploid; M, male; RNA-seq, RNA-sequencing.

[^3]:    Abbreviations: PCG, primary constriction gap.

[^4]:    Abbreviations: FISH, fluorescence in situ hybridization; KD, knock-down

[^5]:    ${ }^{\mathrm{a}}$ Mann-Whitney U Test.

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[^7]:    Two-sided exact binomial test for subclonality trisomy/disomy (expected $2 / 3$ ) vs trisomy/UPID (expected 1/3)

[^8]:    Abbreviations: N.I., no informative cases; del, deletion; mut, mutation

