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Nilsson, Johan

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# Two Toolboxes for Systems with Random Delays

Johan Nilsson

Department of Automatic Control Lund Institute of Technology April 1998

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Author(s) Johan Nilsson	Supervisor
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Abstract

This report is the manual for the Matlab toolboxes pdfbox and dlqgbox. The toolboxes are used for design and analysis of systems with random time delays in the loop. Typically, the delays are transmission delays originating from networks in a distributed real-time control system. The toolbox pdfbox contains functions for description of the random delays. The toolbox dlqgbox contains functions for analysis of covariances in the closed loop system, and functions for LQG-controller design.

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# 1. Introduction

This is a short manual for two Matlab toolboxes developed to do the calculations in the PhD-thesis Nilsson (1998). The basic problem studied is how to do controller design and analysis of closed loops when there are random delays in the loop. The motivating application for studying random delays is real-time control systems with distributed I/O. Typically, measurements and control signals are sent on a field bus or a computer network. The main toolbox is called dlqgbox and is used for design of LQG-controllers and for analysis of covariances in the closed loop. The implementation of dlqgbox uses extensive calculations of mathematical expectations. To simplify the implementation an underlying toolbox has been developed, pdfbox. The pdfbox can be used to build probability distribution functions and to calculate expected values of matrix functions. The toolboxes use some new features in Matlab, which means they require Matlab x, where  $x \geq 5$ . The report is organized with an example from Nilsson (1998) in Section 2. Sections 4 and 5 contain the reference manuals for pdfbox and dlqgbox respectively.

#### **Department users**

The m-files for the toolboxes are found in the directories

```
/regler/matlab-5/johan/pdfbox
/regler/matlab-5/johan/dlqgbox
```

Correct Matlab paths are set up by the commands

>> pdfbox
>> dlqgbox

which are functions in /regler/matlab-5/regler. The test example in Section 2 can be found in

```
/regler/matlab-5/johan/dlqgbox/testex/testex.m
```

#### **External users**

The toolboxes are packed together in the file rdboxes.tar.Z. Unpack the toolboxes with the commands

```
> uncompress rdboxes.tar.Z
```

> tar xvf rdboxes.tar

Two directories need to be added to the Matlab path. This is typically done as

addpath('.../rdboxes/pdfbox', '-end'); addpath('.../rdboxes/dlqgbox', '-end');

where ... is the install directory. The test example in Section 2 can be found in

```
rdboxes/dlqgbox/testex/testex.m
```

#### **Future work / Bugs**

- Theorem 6.2 of Nilsson (1998) is not implemented yet, but starting with pdfbox, finds, and lqrdel it should be a possible generalization.
- During the work a bug in the Matlab function interp1 was found. The bug has been reported to Mathworks, but no solution is yet released. The bug shows up when giving an interval boundary as argument to interp1. The following example shows the buggy behavior.

```
>> xdata=[0:0.006:0.15]; ydata=randn(26,1);
>> interp1(xdata,ydata,0-eps)
ans =
    NaN
>> interp1(xdata,ydata,0)
ans =
    0.8137
>> interp1(xdata,ydata,0.15-eps)
ans =
    1.6360
>> interp1(xdata,ydata,0.15)
ans =
    NaN
```

The function should not return NaN for 0.15. When the bug is fixed references to the function myinterp1, the temporary fix, can be changed to interp1. (Current version is Matlab Version 5.1.0.421, May 25 1997) The temporary solution is used in the functions M1fun.m, M2fun.m, and lqrdel.m in dlqgbox.

#### 2. An Example

The example is taken from Section 5.5 of Nilsson (1998). Consider control of the plant

$$\frac{dx}{dt} = \begin{bmatrix} 0 & 1\\ -3 & -4 \end{bmatrix} x + \begin{bmatrix} 0\\ 1 \end{bmatrix} u + \begin{bmatrix} 35\\ -61 \end{bmatrix} \xi$$
(1)

$$y = \begin{bmatrix} 2 & 1 \end{bmatrix} x + \eta,$$
 (2)

where  $\xi(t)$  and  $\eta(t)$  have mean zero and unit incremental variance. The control objective is to minimize the cost function

$$J = E \lim_{T \to \infty} \frac{1}{T} \int_0^T (x^T H^T H x + u^2) dt, \qquad (3)$$

where  $H = 4\sqrt{5} \begin{bmatrix} \sqrt{35} & 1 \end{bmatrix}$ . The sampling period for the controller is chosen as h = 0.05. The following Matlab code sets up the problem data.

```
A=[0,1;-3,-4]; B=[0;1]; Bk=[35;-61]; C=[2,1];
H=4*sqrt(5)*[sqrt(35),1];
Q1c=H'*H; Q2c=1;
R1c=Bk*Bk'; R2c=1;
h=0.05;
```

#### Synthesis

The continuous time cost function is sampled, Åström and Wittenmark (1997), using the lqgsamp function of lqgbox.

```
[Phi,Gam,Q1,Q2,Q12,R1,Je] = lqgsamp(A,B,h,Q1c,Q2c,zeros(2,1),R1c);
Q=[Q1,Q12;Q12',Q2];
```

For  $\alpha = 1$  the delays,  $\tau_k^{sc}$  and  $\tau_k^{ca}$ , are uniformly distributed on the interval [0, h/2]. The pdfs are built with the commands.

```
pdftsc=newpdf; pdftca=newpdf;
pdftsc=cpdfadd(pdftsc,'uniform',1,0,h/2);
pdftca=cpdfadd(pdftca,'uniform',1,0,h/2);
```

The LQ-controller of Theorem 5.1 in Nilsson (1998) is calculated by first solving the corresponding Riccati equation. A start value is found by iteration the Riccati recursion some steps.

```
[S0]=startval(A,B,h,Q,pdftsc,pdftca,5);
```

The Riccati equation is then solved using the solver finds.

[S,PC1,PC2]=finds(A,B,h,Q,pdftsc,pdftca,S0);

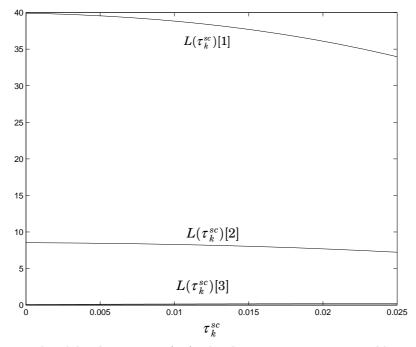
The function returns the solution S together with some precalculations for use in lqrdel. The optimal controller

$$u_k = -L(\tau_k^{sc}) \begin{bmatrix} x_k \\ u_{k-1} \end{bmatrix}$$
(4)

is calculated using lqrdel. The tabular discretization of  $L(\tau_k^{sc})$  is here chosen to 100 values.

[Lvec,tauvec]=lqrdel(S,Q,100,pdftsc,pdftca,h,PC1,PC2);

The resulting  $L(\tau_k^{sc})$  is shown in Figure 1. The observer is designed with the



**Figure 1** Plot of the elements in  $L(\tau_k^{sc})$ . The elements are varying smoothly enough for a discretization in 100 points.

standard observer tool lqed.

[K,Kb,Kv,P,Pf] = lqed(Phi,C,R1,1);

#### Analysis

The idea is to formulate the closed loop system and the use then function coveval. Using (5.2) and (5.31) of Nilsson (1998) the closed loop system can be written as

$$z_{k+1} = \begin{bmatrix} \Phi & \Gamma_{1}() - \Gamma_{0}()L_{2}() & -\Gamma_{0}()L_{1}() \\ 0 & -L_{2}() & -L_{1}() \\ \bar{K}C\Phi & \Gamma_{1}() - \Gamma_{0}()L_{2}() & \Phi - \bar{K}C\Phi - \Gamma_{0}()L_{1}() \end{bmatrix} z_{k} + \begin{bmatrix} \Gamma_{v} & 0 \\ 0 & 0 \\ \bar{K}C\Gamma_{v} & \bar{K} \end{bmatrix} e_{k}, \quad (5)$$

where

$$z_{k} = \begin{bmatrix} x_{k} \\ u_{k-1} \\ \hat{x}_{k|k} \end{bmatrix}$$
(6)

$$e_k = \begin{bmatrix} v_k \\ w_{k+1} \end{bmatrix}. \tag{7}$$

The arguments of  $\Gamma_0$ ,  $\Gamma_1$ , and L have been suppressed. The feedback gain  $L(\tau_k^{sc})$  has also been partitioned as  $L(\tau_k^{sc}) = [L_1(), L_2()]$ . To make  $e_k$  have unit variance  $\Gamma_v$  has been introduced as the Cholesky factorization of R1. In Matlab this is done as

Gammav=chol(R1)';

Notice that  $e_k$  is of dimension 3. We will analyze the closed loop covariances with the function coveval. This needs a function that returns  $\Phi(\tau_k^{sc}, \tau_k^{ca}, i)$  and  $\Gamma(\tau_k^{sc}, \tau_k^{ca}, i)$ . The function coveval is designed to handle the situation with a Markov chain postulation the delay distributions. In our case the delays have constant distributions, which corresponds to one Markov state. The delay behavior is described with a *Markov structure*. In this example it is programmed as

```
ms=newms(1,1);
ms=setpdf(ms,1,pdftsc,pdftca);
```

The function describing the closed loop needs some of the matrices describing the process and the controller. This is done by defining these as global variables.

global Lvec tauvec Kb A B C h Gammav Q

The closed loop is described with the following function named excl.m.

```
function [Phii,Gami]= excl(tsc,tca,i);
if isempty(tsc),
  Phii=zeros(5,5);
  Gami=zeros(5,3);
else
  global Lvec tauvec Kb A B C h Gammav
  n=2;
  X=[A,B;zeros(1,n),zeros(1)];
  T1=[eye(n),zeros(n,1)];
```

```
T2=[zeros(n,1);eye(1)];
Gam0=T1*expm(X*(h-(tsc+tca)))*T2;
Gam1=expm(A*(h-(tsc+tca)))*T1*expm(X*(tsc+tca))*T2;
Phi=expm(A*h);
L=interp1(tauvec,Lvec,tsc);
L1=L(1,1:2); L2=L(1,3);
Phii=[Phi , Gam1-Gam0*L2, -Gam0*L1;
zeros(1,2) , -L2 , -L1;
Kb*C*Phi , Gam1-Gam0*L2, Phi-Kb*C*Phi-Gam0*L1];
Gami=[Gammav , zeros(2,1);
zeros(1,2) , 0;
Kb*C*Gammav, Kb];
end;
```

For efficiency it would have been advantageous to calculate X, T1, T2, and Phi ones outside the function and use these as global variables. The closed loop covariances are now calculated with

Res=coveval('excl',ms);

The cost function we are to evaluate can be written as

The covariance P can be accessed with Res.P. The first part of (8) is calculated using the function expect with the following function named costmat.m.

```
function [out]=costmat(tsc);
if isempty(tsc),
   out=zeros(5,5);
else
   global Lvec tauvec Q
   L=interp1(tauvec,Lvec,tsc);
   L1=L(1,1:2); L2=L(1,3);
   X=[eye(2) , zeros(2,1), zeros(2,2);
      zeros(1,2) , -L2 , -L1];
   out=X'*Q*X;
end;
The expected value is calculated with
```

```
St=expect(pdftsc,'costmat');
```

```
The cost can now be evaluated with
```

```
Cost=trace(St*Res.P)
```

```
The resulting cost is 8.15 \cdot 10^3.
```

# 3. References

- ÅSTRÖM, K. J. and B. WITTENMARK (1997): Computer-Controlled Systems, third edition. Prentice Hall.
- NILSSON, J. (1998): *Real-Time Control Systems with Delays*. PhD thesis ISRN LUTFD2/TFRT--1049--SE, Department of Automatic Control, Lund Institute of Technology, Lund, Sweden.

# 4. Reference Guide for pdfbox

Function	Purpose
cpdfadd	Add a continuous distribution function to a pdf
cuth	Cut all higher than $t$ in a pdf
cutl	Cut all lower than $t$ in a pdf
dpdfadd	Add a Dirac to a pdf
expect	Calculate the expected value of a function
geprob	Calculate the probability that a variable is greater than or equal $t$
gprob	Calculate the probability that a variable is greater than $t$
leprob	Calculate the probability that a variable is less than or equal $t$
lprob	Calculate the probability that a variable is less than $t$
meanpdf	Calculate the mean value of a pdf
newms	Create a new Markov structure
newpdf	Create a new pdf-variable
plotpdf	Plot a pdf
prob	The probability that a random variable is exactly equal to $t$ .
setpdf	Set pdfs for a Markov structure
varpdf	Calculate the variance of a pdf

Add a continuous distribution function to a pdf

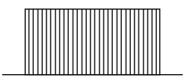
#### Synopsis

opdf=cpdfadd(ipdf,type,ptot,tmin,tmax);

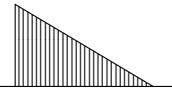
#### Description

Adds a continuous distribution function function to ipdf. The total probability of the added distribution function is ptot. If ipdf does not contain anything ptot must be 1. If ipdf already contains a distribution this is scaled down a factor (1 - pval). The added distribution has support on the interval [tmin, tmax]. The distribution type is set with the parameter type. The following types are implemented.

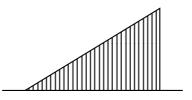
• 'uniform' Uniform distribution with support on the interval [*tmin*, *tmax*], and total probability ptot.



• 'ltriang' Left triangular distribution with support on the interval [tmin, tmax], and total probability ptot.



• 'rtriang' Right triangular distribution with support on the interval [*tmin*, *tmax*], and total probability ptot.



### Example

This command sequence creates a pdf with uniform distribution on [0, 1].

```
pdf=newpdf;
pdf=cpdfadd(pdf,'uniform',1,0,1);
```

#### See Also

newpdf dpdfadd

Cut all higher than t in a pdf

#### Synopsis

[opdf,Ph]=cuth(ipdf,t)

# Description

Cut all higher than t in ipdf. The new distribution, opdf, is scaled to be a valid pdf. The part cut had the probability Ph.

#### See Also

cutl

Cut all lower than t in a pdf

#### Synopsis

[opdf,Pl]=cutl(ipdf,t)

## Description

Cut all lower than t in ipdf. The new distribution, opdf, is scaled to be a valid pdf. The part cut had the probability Pl.

#### See Also

 $\mathtt{cuth}$ 

Add a Dirac to a pdf

#### Synopsis

opdf=dpdfadd(ipdf,tval,pval)

#### Description

Adds a Dirac function to ipdf. The probability of the Dirac is pval, and it is added for the value tval. If ipdf does not contain anything pval must be 1. If ipdf already contains a distribution this is scale down a factor (1 - pval).

#### Example

This command sequence creates a pdf with probability 0.5 for the values 0 and 1.

```
pdf=newpdf;
pdf=dpdfadd(pdf,0,1);
pdf=dpdfadd(pdf,1,0.5);
```

#### See Also

newpdf cpdfadd

Calculate the expected value of a function

#### **Synopsis**

```
val=expect(pdf,pfun,p1,p2,p3,...)
```

#### Description

Calculates the expected value of a matrix valued function pfun. The first argument of pfun is a random variable with distribution pdf. The optional parameters p1, p2, p3 etc are passed on to pfun. pfun is a matrix valued function with the following definition.

out=pfun(t,p1,p2,p3,...)

If t is empty ([]) a matrix with the same size as the usual output for the pfun should be returned.

#### Example

The following is an example pfun for calculating the mean of a pdf.

```
function [out]=meanfun(t);
```

```
if isempty(t),
   out=0;
else
   out=t;
end;
```

#### Algorithm

The following integral is calculated numerical.

$$\mathbf{E}(pfun) = \int pdf(s) \, pfun(s) \, ds$$

Diracs are taken out of the integral, and continuous parts of the integral is calculated with ode23.

#### See Also

meanpdf varpdf

Calculate the probability that a random variable is greater than or equal t.

#### **Synopsis**

P=geprob(pdf,t)

#### Description

Calculates the probability that a random variable with distribution  ${\tt pdf}$  is greater than or equal t.

#### See Also

gprob leprob lprob prob

Calculate the probability that a random variable is greater than t.

## Synopsis

P=gprob(pdf,t)

#### Description

Calculates the probability that a random variable with distribution  ${\tt pdf}$  is greater than  ${\tt t}.$ 

#### See Also

geprob leprob lprob prob

Calculate the probability that a random variable is less than or equal t.

#### **Synopsis**

P=leprob(pdf,t)

#### Description

Calculates the probability that a random variable with distribution pdf is less than or equal t.

#### See Also

geprob prob

Calculate the probability that a random variable is less than t.

# Synopsis

P=lprob(pdf,t)

## Description

Calculates the probability that a random variable with distribution pdf is less than t.

#### See Also

geprob gprob leprob prob

# meanpdf

# Purpose

Calculate the mean value of a pdf

# Synopsis

mean=meanpdf(pdf)

# Description

Calculates the mean value of pdf.

#### See Also

expect varpdf

Create a new Markov structure

#### **Synopsis**

ms=newms(s,Q)

#### Description

Create a Markov chain structure, ms, with two pdfs associated with each Markov state. The pdfs are added with the function setpdf.

#### **Parameters**

s: number of states in the Markov chain

Q: transistion matrix for the Markov chain

#### See Also

setpdf

Create a new pdf-variable

# Synopsis

pdf=newpdf()

# Description

Creates a new pdf. The new pdf i not contain anything yet and is not valid for use in calculations.

#### See Also

dpdfadd cpdfadd

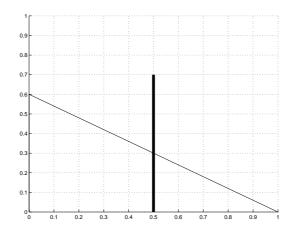
Plot a pdf

# Synopsis

plotpdf(pdf)

#### Example

```
pdf=newpdf;
pdf=cpdfadd(pdf,'ltriang',1,0,1);
pdf=dpdfadd(pdf,0.5,0.7);
plotpdf(pdf);
```



# Description

Plots both continuous and discrete parts of a pdf.

Calculate the probability that a random variable is exactly equal to t.

#### Synopsis

P=prob(pdf,t)

#### Description

Calculates the probability that a random variable with distribution pdf is exactly equal to t. This needs pdf to contain a Dirac at t.

#### See Also

geprob leprob

# setpdf

#### Purpose

Set pdfs for a Markov structure

#### **Synopsis**

msout=setpdf(msin,i,pdftsci,pdftcai)

#### Description

Set the two pdfs assosiated with Markov state i.

#### **Parameters**

msin: Markov structure to modify

i: Markov state number

pdftsci: Pdf for  $au^{sc}$ 

pdftcai: Pdf for  $au^{ca}$ 

### See Also

newms

# varpdf

# Purpose

Calculate the variance of a pdf

# Synopsis

var=varpdf(pdf)

# Description

Calculates the variance of pdf.

#### See Also

expect meanpdf

# 5. Reference Guide for dlqgbox

Function	Purpose
coveval	Covariance matrix evaluation
finds	Solve stochastic Riccati equation
lqrdel	Calculate optimal LQG-controller
startval	Iterate stochastic Riccati equation

Covariance matrix evaluation

#### **Synopsis**

[Res]=coveval(clfun,ms)

#### Description

Covariance matrix evaluation by Theorem 6.1 in Nilsson (1998). The covariance R is assumed to be an identity matrix. If not, it can be included in the  $\Gamma$ -matrix by Cholesky factorization. The returned covariance matrix is only valid if the closed loop system is stable.

#### **Parameters**

Res: Matlab-structure containing the result as the following parts.

P: Stationary covariance matrix for the closed loop system clfun

stable: 1 if system is stable, 0 if not stable

Ptilde(i).val:  $\tilde{P}_i$ -matrices. These can be necessary when later evaluating a quadratic cost function.

clfun: cl-function describing the closed loop

$$z_{k+1} = \Phi(\tau_k^{sc}, \tau_k^{ca}, i) z_k + \Gamma(\tau_k^{sc}, \tau_k^{ca}, i) e_k,$$

$$(9)$$

where  $e_k$  is white noise with unit covariance. The cl-function should have the following synopsis

```
function [Phii,Gami]=clfun(tsc,tca,i)
```

where tsc and tca are the delays, and i is the Markov state number. If called with both tsc and tca empty ([]), Phii and Gami of correct sizes should be returned.

Precalulated variables can be used in clfun by declaring them as global in both the function calling coveval, and in clfun.

ms: Markov structure describing the underlying Markov chain and delays.

#### See Also

pdfbox newms setpdf chol

Solve stochastic Riccati equation

#### Synopsis

[S,PC1,PC2]=finds(A,B,h,Q,pdftsc,pdftca,S0)

#### Description

Solve stochastic Riccati equation in Theorem 5.1 of Nilsson (1998). The time delays  $\tau_k^{sc}$  and  $\tau_k^{ca}$  are assumed to have the probability distribution function pdftsc and pdftca. The delay variation may never be greater than h.

#### Parameters

A,B: System matrices

h: Sampling period

Q: Cost function

pdftsc,pdftca: Probability distribution functions

S0: Optional argument, initial guess for S

S: Stationary solution of the Riccati equation

PC1, PC2: Precalculated data for use in lqrdel

#### Algorithm

Kleinmann iteration

#### See Also

startval lqrdel

Calculate optimal LQG-controller

#### Synopsis

[Lvec,tauvec]=lqrdel(S,Q,nvals,pdftsc,pdftca,h,PC1,PC2)

#### Description

Calculate optimal LQG-controller in Theorem 5.1 of Nilsson (1998). The time delays  $\tau_k^{sc}$  and  $\tau_k^{ca}$  are assumed to have the probability distribution function pdftsc and pdftca. The delay variation may never be greater than *h*. S, PC1, PC2 are calculated using finds.

#### **Parameters**

S: Stationary solution of the Riccati equation

**Q:** Cost function

nvals: number of values in each cont part of the L-tabular

pdftsc,pdftca: Probability distribution functions

h: Sampling period

PC1,PC2: Precalculated data from finds

Lvec: Vector with the feedback L for  $au_{sc}$  in tauvec

tauvec: Values for  $au_{sc}$  in Lvec

#### See Also

finds

Iterate stochastic Riccati equation

#### Synopsis

S0=startval(A,B,h,Q,pdftsc,pdftca,nit,Sinit)

#### Description

Iterate stochastic Riccati equation in Theorem 5.1 of Nilsson (1998) to find a stabilizing solution. This can be necessary for the Kleinmann iteration done in finds to converge. The time delays  $\tau_k^{sc}$  and  $\tau_k^{ca}$  are assumed to have the probability distribution function pdftsc and pdftca. The delay variation may never be greater than h.

#### **Parameters**

A, B: System matrices

h: Sampling period

**Q:** Cost function

pdftsc,pdftca: Probability distribution functions

nit: Number of iterations to do

Sinit: Start value for *S*, default= 1E6 \* eye(n + 1)

S0: Value for S after nit iterations

#### See Also

finds lqrdel