0.4pt0pt 0pt0pt

Contents

1	\mathbf{Use}	er guide to SMI 2.0
	1.1	List of functions in SMI 2.0
	1.2	Function descriptions
		cestac
		cestbd
		cestx
		chebest
		chebsim
		cordom
		cordpi
		cordpo
		css2th
		cth2ss
		destac
		destbd
		destk
		destx
		dfunlin
		dfunwie
		dmoesp
		dordeiv
		dordom
		dordpi
		dordpo
		dordrs
		drpi
		drpo
		drslslin
		dslslin
		dslswie
		dss2th
		dth2ss
		kronekf
		1

CONTENTS

ncdestbd.																45
ncdlsim .																
orderselect																
prbn																
shave																
$tlsim \dots$																
vaf																53

Chapter 1

User guide to SMI 2.0

1.1 List of functions in SMI 2.0

The following table gives an overview of the functions in the SMI toolbox. Some function are new to this toolbox. Others appeared in the previous version of the toolbox under an other name. These names have been changed to prevent conflicts with other toolboxes and to provide a more consistent naming. This makes the functions easier to recognize and remember.

1.1. LIST OF FUNCTIONS IN SMI 2.0

function	description	old name
	Discrete time moesp	
dordom	Ordinary moesp preprocessor	dordom
dordpi	Ppast input moesp preprocessor	dordpi
dordpo	Past output moesp preprocessor	dordpo
dordeiv	Eiv moesp preprocessor	-
dordrs	Reconstructed state moesp preprocessor	dordrs
destac	Estimate A,C	dmodpi,dmodpo
destbd	Estimate B,D	dac2bd,destb
destk	Estimate Kalman gain	dmodpo
destx	Estimate initial state	dinit
dmoesp	Frontend for DT moesp	-
	Continuous time moesp	
cordom	Ordinary moesp preprocessor	-
cordpi	Past input moesp preprocessor	-
cordpo	Past output moesp preprocessor	-
cestac	Estimate A,C	-
cestbd	Estimate B,D	-
cestx	Estimate initial state	-
	Recursive moesp	
drpi	Recursive PI moesp	-
drpo	Recursive PO moesp	-
	SLS optimization	,
dss2th	Parameterization of state space system	ss2thon
dth2ss	Reconstruction of state space system	th2sson
dslslin	Optimize DT linear model using SLS	gnlisls
dslswie	Optimize DT wiener model using SLS	gnwisls
dfunlin	Cost-function for dslslin	-
dfunwie	Cost-function for dslswie	-
drslslin	Recursive optimization of DT model using SLS	-
clslin	Optimize CT linear model using SLS	-
cfunlin	Cost-function for dslslin	-
crslslin	Recursive optimization of CT model using SLS	-
	Non causal models	
ncdlsim	Simulate non causal model	-
ncdestac	Estimate A and C for non-causal model	-
ncdestbd	Estimate B and D for non-causal model	-
kroneckf	Calculate Kronecker canonical form	-
	Nonlinear models	
chebest	Estimate MIMO nonlinear model	tchebest
chebsim	Simulate MIMO nonlinear model	tchebest
	Miscellaneous	
prbn	Pseudo random binary sequence	prbn
vaf	Variance accounted for	vaf
shave	Remove peaks and outliers	shave

1.2 Function descriptions

cestac

Purpose

Estimates the matrices A and C of a LTI state space model using the result of the preprocessor routines \mathtt{cordxx} (\mathtt{cordom} , \mathtt{cordpo} , etc.). General model structure:

$$\dot{x}(t) = Ax(t) + Bu(t) + w(t)$$

$$y(t) = Cx(t) + Du(t) + v(t)$$

For more information about the disturbance properties see the help pages for the preprocessor cordxx functions.

Syntax

[A,C]=cestac(R,n);

Inputs

R Data structure obtained from cordxx, containing the tri-

angular factor and additional information (such as i/o di-

mension etc.).

Order of system to be estimated.

Outputs

A,C Estimated system matrices.

See also

cordom, cordpi, cordpo, cestbd

cestbd

Purpose

Estimates the matrices B and D of the state space model

$$\dot{x}(t) = Ax(t) + Bu(t) + w(t)$$

 $y(t) = Cx(t) + Du(t) + v(t)$
 $x(0) = x_0$

using the knowledge of the pair A, C. This function can concatenate different input-output data batches, through the matrix R and Rold). B and D and x_0 are calculated by solving a linear least squares problem.

Syntax

```
[B,D,x0,R]=cestbd(u,y,A,C,[fB fD fx],Rold);
[B,D]=cestbd(u,y,A,C);
```

Inputs

u,y A,C	The input and output data of the system to be identified. The estimated system matrices A and C .
model	Three element flag vector $\begin{bmatrix} fB & fD & fx \end{bmatrix}$ indicating
	whether B , D and x_0 should be estimated. The default
	value is $\begin{bmatrix} 1 & 1 & 0 \end{bmatrix}$. The matrix B or D can be assumed
	zero by setting fB or fD to zero. The calculation of x_0
	can be omitted by setting fx to zero. However x_0 will not
	be assumed zero then. It's influence will still be taken into
	account for the computation of B and D .

Rold R matrix obtained from previous data batch. This variable can be used to process data in batches, or to combine data from different experiments.

Outputs

B,D	The estimated system matrices B and D .
x0	The estimated initial state of the system.
R	Compressed data matrix, storing information on the cal-
	culation of the matrices B and D in following cestbd.
	Used when analyzing multiple input-output data sequences.

See also

cordxx, cestac, cestx

cestx

Purpose

Estimate the initial state, given the estimated system matrices and a set of input/output data.

Syntax

x0=cestx(u,y,Ts,A,B,C,D);

Inputs

u,y The input and output data of the system to be identified.

Ts Sampling period of the measured data.

A,B,C,D System matrices.

Outputs

x0 Estimated initial state.

See also

cestbd

chebest

Purpose

This function estimates a MIMO static nonlinear function between the signals y and z. The function is estimated on the basis of Chebychev polynomials. Before estimating the coefficients of the polynomials the input signal is shifted and scaled to fall within the region [-1,1]. The shifting and scaling factors are included in the parameter vector.

Syntax

```
[thl,ze,Phi]=chebest(y,z,nn);
```

Inputs

y,z Input and output of the nonlinearity.

nn Order of the Chebychev polynomials in the nonlinear func-

tion.

Outputs

thl Vector with the parameters of the static nonlinearity.

ze Estimated output, on basis of the model that is obtained.

Phi matrix with the Chebychev functions of y, such that

 $ze = Phi \times thl.$

See also

chebsim, dslswie

chebsim

Purpose

Simulates a static nonlinear function on the basis of Chebychev polynomials with input y. The coefficients of the Chebychev polynomials are given with the vector thl, and commonly estimated with either dslswie or chebest.

Syntax

[ze,Phi]=chebsim(y,thl)

Inputs

y The input to the nonlinearity.

thl Parameter matrix, with coefficients of the nonlinear func-

tion.

Outputs

ze Estimated output.

Phi matrix with the Chebychev functions of y, such that

 $ze = Phi \times thl.$

See also

chebest, dslswie

cordom

Purpose

This function is a preprocessor function that extracts the column-space of the extended observability matrix of a continuous time LTI system from input/output data. The estimated column-space is used in the function cestac to extract the matrices A and C. Model structure:

$$\dot{x}(t) = Ax(t) + Bu(t)$$

$$y(t) = Cx(t) + Du(t)$$

This function does not use an instrumental variable and is comparable to dordom for the discrete time case.

Syntax

```
[Sn,R]=cordpo(u,y,t,a,i);
[Sn,R]=cordpo(u,y,t,a,i,Rold);
```

Inputs

u,y	The input and output data of the system to be identified.
t	Sampling time or time-vector for the sampled data.
a	Filter coefficient of the Laguerre filters that are used in
	the algorithm. When a is negative, the anti-causal in-
	strumental variable method is used. Otherwise the causal
	instrumental variable method is chosen.
i	The dimension parameter that determines the number of
	block rows in the processed Hankel matrices. This param-
	eter should be chosen larger than the expected system or-
	der. The optimal value has to be found by trial and error.
	Generally twice as large is a good starting value.
Rold	Data structure obtained from processing a previous data-
	batch with $cordom$ containing the same items as R .

Outputs

Sn	Singular values bearing information on the order of the
	system.
R	Data structure used by $cestac$ for the estimation of A and
	C or by a next call to cordom. This matrix contains the
	triangular factor, estimated column-space and additional
	information (such as i/o dimension etc.).

See also

cordpi, cordpo, cestac, cestbd.

cordpi

Purpose

This function is a preprocessor function that extracts the column-space of the extended observability matrix of a continuous time LTI system from input/output data. The estimated column-space is used in the function cestac to extract the matrices A and C. Model structure:

$$\dot{x}(t) = Ax(t) + Bu(t)$$

$$y(t) = Cx(t) + Du(t) + v(t)$$

where v(t) is a finite variance disturbance on the output and is independent of the noise-free input u(t). This function uses the past input instrumental variable and is comparable to dordpi for the discrete time case.

Syntax

```
[Sn,R]=cordpi(u,y,t,a,i);
[Sn,R]=cordpi(u,y,t,a,i,Rold);
```

Inputs

u,y	The input and output data of the system to be identified.
t	Sampling time or time-vector for the sampled data.
a	Filter coefficient of the Laguerre filters that are used in
	the algorithm. When a is negative, the anti-causal in-
	strumental variable method is used. Otherwise the causal
	instrumental variable method is chosen.
i	The dimension parameter that determines the number of
	block rows in the processed Hankel matrices. This param-
	eter should be chosen larger than the expected system or-
	der. The optimal value has to be found by trial and error.
	Generally twice as large is a good starting value.
Rold	Data structure obtained from processing a previous data-
	batch with cordpi containing the same items as R .
_	•

Outputs

Sn	Singular values bearing information on the order of the
	system.
R	Data structure used by $cestac$ for the estimation of A and
	C or by a next call to cordpi. This matrix contains the
	triangular factor, estimated column-space and additional
	information (such as i/o dimension etc.).

See also

cordom, cordpo, cestac, cestbd.

cordpo

Purpose

This function is a preprocessor function that extracts the column-space of the extended observability matrix of a continuous time LTI system from input/output data. The estimated column-space is used in the function cestac to extract the matrices A and C. Model structure:

$$\begin{aligned} \dot{x}(t) &=& Ax(t) + Bu(t) + w(t) \\ y(t) &=& Cx(t) + Du(t) + v(t) \end{aligned}$$

where w(t) is a Wiener noise signal and v(t) a finite variance disturbance on the output, independent of the noise-free input u(t).

This function uses the past output instrumental variable and is comparable to dordpo for the discrete time case.

Syntax

```
[Sn,R]=cordpo(u,y,t,a,i);
[Sn,R]=cordpo(u,y,t,a,i,Rold);
```

Inputs

•	
u,y	The input and output data of the system to be identified.
t	Sampling time or time-vector for the sampled data.
a	Filter coefficient of the Laguerre filters that are used in
	the algorithm. When a is negative, the anti-causal in-
	strumental variable method is used. Otherwise the causal
	instrumental variable method is chosen.
i	The dimension parameter that determines the number of
	block rows in the processed Hankel matrices. This param-
	eter should be chosen larger than the expected system or-
	der. The optimal value has to be found by trial and error.
	Generally twice as large is a good starting value.
Rold	Data structure obtained from processing a previous data-
	batch with cordpo containing the same items as R .
Outputs	•

Outputs

Sn	Singular values bearing information on the order of the
	system.
R	Data structure used by $cestac$ for the estimation of A and
	C or by a next call to cordpo. This matrix contains the
	triangular factor, estimated column-space and additional
	information (such as i/o dimension etc.).

See also

cordom, cordpi, cestac, cestbd.

css2th

Purpose

This function converts a continuous time state space model to a parameter vector that describes the model.

Model structure:

$$\dot{x}(t) = Ax(t) + Bu(t) + Ke(t)$$

$$y(t) = Cx(t) + Du(t) + e(t)$$

$$x(0) = x_0$$

Syntax

```
[theta,params] = css2th(A,B,C,D,x0,K,partype);
[theta,params] = css2th(A,B,C,D);
[theta,params] = css2th(A,C);
```

Inputs

A,B,C,D System matrices describing the state space system. The

B and D matrices are optional. An optional element can be left out or given as an empty matrix to indicate it is

not part of the model.

x0 Initial condition, This is optional.

K Kalman gain. Also this matrix is optional.

partype This parameter specifies the type of parameterization that

is used to parameterize the state space model. Two types of parameterization are supported: 'on'= Output Normal

and 'tr'=TRidiagonal.

Outputs

theta Parameters vector describing the system.

params A structure that contains the dimension parameters of the

system, such as the order, the number of inputs, whether

 B, D, x_0 or K are present, etc.

T Transformation matrix between the input state space sys-

tem and the state space system in the form described by

theta (output normal or tridiagonal).

See also

cth2ss, cslslin

cth2ss

Purpose

This function converts a parameter vector that describes a continuous time state space model in output normal form to the state space matrices of that model.

Model structure:

$$\dot{x}(t) = Ax(t) + Bu(t) + Ke(t)$$

$$y(t) = Cx(t) + Du(t) + e(t)$$

$$x(0) = x_0$$

Syntax

[A,B,C,D,x0,K] = cth2ss(theta,params)
[A,C] = cth2ss(theta,params)

Inputs

theta Parameter vector describing the system.

params A structure that contains the dimension parameters of the

system, such as the order, the number of inputs, whether

 D, x_0 or K are present, etc.

Outputs

A,B,C,D System matrices describing the state space system in out-

put normal form. If theta does not contain parameters for D, this matrix will be returned as an empty matrix.

x0 Initial condition. If theta does not contain parameters for

 x_0 this vector will be returned as an empty matrix.

K Kalman gain. Same here.

See also

cth2ss, cslslin

destac

Purpose

Estimates the A and C matrices of a LTI state space model form using the result of the preprocessor routines dordxx. (dordom, dordpo, etc.)

General model structure:

$$x(k+1) = Ax(k) + Bu(k)$$
$$y(k) = Cx(k) + Du(k)$$

For information about the possible disturbance signals see the help pages for the preprocessor dordxx functions.

Syntax

[A,C]=destac(R,n);

Inputs

R Data structure obtained from a dordxx function, contain-

ing the triangular factor, estimated column-space and ad-

ditional information (such as i/o dimension etc.).

Order of system to be estimated.

Outputs

A,C Estimated system matrices.

See also

dordom, dordpi, dordpo, dordeiv, dordrs, destbd

destbd

Purpose

Estimates the matrices B and D of the state space model

$$x(k+1) = Ax(k) + Bu(k) + w(k)$$

$$y(k) = Cx(k) + Du(k) + v(k)$$

using the knowledge of the pair A, C. This function can concatenate different input-output data batches, through the matrix R and $R_{\rm old}$. B and D are calculated by solving a linear least squares problem. The function can handle errors-in-variables models by using a instrumental variable.

Syntax

```
[B,D]=destbd(u,y,A,C);
[B,D,x0,R,Phi]=destbd(u,y,A,C,[fB fD fx],Rold,iv,niv);
```

Inputs

u,y	The input, and output data of the system to be identified.
A,C	The state space matrices A and C .
model	Three element flag vector $[fB \ fD \ fx]$ indicating
	whether B , D and x_0 should be estimated. The default
	value is $\begin{bmatrix} 1 & 1 & 0 \end{bmatrix}$. The matrix B or D can be assumed
	zero by setting fB or fD to zero. The calculation of x_0
	can be omitted by setting fx to zero. However x_0 will
	not be assumed zero. It's influence will still be taken into
	account for the computation of B and D . Variables that
	are not asked for will be returned as empty matrices.
Rold	R matrix obtained from previous data batch. This vari-
	able can be used to process data in batches, or to combine
	data from different experiments.
iv	Instrumental variable. For instance, for the errors-in-
	variables case the iv can be the past output or for closed
	loop data, the reference input.
niv	Three element vector describing the number of lagged
	IVs used. $niv(1)$ is the number of lagged IVs, $niv(2)$ the
	number of lagged past outputs, and niv(3) the number of
	lagged past inputs. If only one element is present, no past
	data is used. If not given or empty appropriate default
	values are used. When past data is used as instrumental
	variable, about half of the input/output data is used for
	the instrument.

Outputs

B,D The estimated system matrices B and D. x0The estimated initial state of the system.

R Compressed data matrix, storing information on the cal-

culation of the matrices B and D in following destbd. Used when analyzing multiple input-output data sequences.

Regressors matrix that was used for the Least squares

estimate.

See also

Phi

destac destx

destk

Purpose

Estimates the Kalman gain of a innovations model, when the matrices A and C are known. They can be estimated with the functions dordpo and destac. Model structure:

$$x(k+1) = Ax(k) + Bu(k) + w(k)$$

$$y(k) = Cx(k) + Du(k) + v(k)$$

where w(k), v(k) are zero-mean white noise sequences, independent of the noise-free input u(k).

Syntax

K=destk(A,B,C,D,R)
K=destk(A,C,R)

Inputs

A,B,C,D State space matrices (B and D are optional).

R Data structure that is obtained from dordpo. This matrix contains compressed data needed to estimate the Kalman

gain. This includes the lower triangular factor and additional information (such as i/o dimension etc.).

Outputs

K Estimated Kalman gain.

See also

See also: dordpo, destac, destbd

destx

Purpose

Estimates the initial state of a state space system on the basis of the system matrices and a set of input/output data.

Syntax

x0=destx(u,y,A,B,C,D);

Inputs

u,y The input and output data of the system to be identified.

A,B,C,D System matrices.

Outputs

x0 Estimated initial state.

See also

destbd

dfunlin

Purpose

This function implements the cost-function for dslslin It is not meant for stand-alone use.

Syntax

epsilon=dfunlin(thn,u,y,params)

Inputs

thn Parameter vector describing the system matrices A and

C.

u,y The input and output data of the system to be optimized.

A structure that contains the dimension parameters of the

system, such as the order, the number of inputs, whether

D, x_0 or K is present in the model, etc.

Outputs

epsilon Output of the cost-function, which is the square of the er-

ror between the output and the estimated output, divided

by the number of samples.

See also

dslslin, dslswie, dfunwie

dfunwie

Purpose

This function implements the cost-function for dslswie It is not meant for stand-alone use.

Syntax

epsilon=dfunwie(thn,u,y,params)

Inputs

thn Parameter vector describing the system matrices A, B, C

and D.

u,z The input and output data of the system to be optimized.

A structure that contains the dimension parameters of the

system, such as the order, the number of inputs, whether

D or x_0 is present in the model, etc.

Outputs

epsilon Output of the cost-function, which is the square of the er-

ror between the output and the estimated output, divided

by the number of samples.

See also

dslswie, dslslin, dfunlin

dmoesp

Purpose

High level function for the discrete time moesp that gives the user a simple interface to the lower level MOESP functions such as dordxx and destac. This function calculates the system matrices A, B, C and D from the given input and output data sequences u and y. Model structure:

$$x(k+1) = Ax(k) + Bu(k)$$

$$y(k) = Cx(k) + Du(k)$$

For information about the possible disturbance signals see the help pages for the preprocessor dordxx functions.

The user only needs to specify the input and output data. If the order is not given, a order selection dialog is shown where the user can select the order by examining the singular value plot.

Syntax

```
[A,B,C,D]=dmoesp(u,y,maxorder)
[A,B,C,D,K]=dmoesp(u,y,maxorder,order,method)
```

Inputs

u,y Input and Output data sequence.

maxorder Maximum expected order of the system, this value is

used as the Hankel dimension parameter in the under-

lying identification routines.

order Order of the system to be estimated, if not specified a

dialog will be presented which allows the user to choose

the order.

method Method used for identification. possible options:

"om" ordinary moesp"pi" past input moesp"po" past output moesp

The default value is past output moesp.

Outputs

A,B,C,D State space matrices describing the estimated model.

K Estimated Kalman gain, only available for past output

moesp.

See also

destac, dordpo, etc

dordeiv

Purpose

dordeiv is a preprocessor function that extracts the column-space of the extended observability matrix from input/output data. Data from different experiments can be concatenated using the extra input argument Z. The estimated column-space is used in the function destac to extract the matrices A and C. This function implements the errors-in-variables MOESP algorithm which can be used for the errors-in-variables identification problem.

Model structure:

$$x(k+1) = Ax(k) + B\tilde{u}(k) + w(k)$$

$$y(k) = Cx(k) + D\tilde{u}(k) + v(k)$$

with measurements

$$u(k) = \tilde{u}(k) + f(k)$$
 and $y(k)$

where f(k), w(k) and v(k) are zero-mean white noise sequences independent of the input $\tilde{u}(j)$ for $k \geq j$.

The system can be operated under either open-loop or closed-loop. For closed-loop operation, r(k) is an external reference input. For open-loop operation, where $\tilde{u}(k)$ is white noise, dordpo will give better results.

Syntax

Inputs

u,y r	The input and output data of the system to be identified. Closed-loop reference input.
i	The dimension parameter that determines the number of
	block rows in the processed Hankel matrices. This param-
	eter should be chosen larger than the expected system or-
	der. The optimal value has to be found by trial and error.
	Generally twice as large is a good starting value.
Zold	Matrix obtained from processing a previous data-batch
	with dordrs.

28

Outputs

Sn Singular values bearing information on the order of the

system

R Data structure used by destac for the estimation of A

and ${\cal C}.$ This matrix contains the triangular factor, estimated column-space and additional information (such as

i/o dimension etc.).

Z Matrix containing information on system which can be

used by future calls of dordeiv.

See also

dordom, dordpi, dordpo, dordrs, destac, destbd.

dordom

Purpose

dordom is a preprocessor function that extracts the column-space of the extended observability matrix from input/output data. Data from different experiments can be concatenated using the extra input argument R. The estimated column-space is used in the function destac to extract the matrices A and C.

This function implements the ordinary MOESP algorithm which can only be used for the noise free identification problem.

Model structure:

$$x(k+1) = Ax(k) + Bu(k)$$

$$y(k) = Cx(k) + Du(k)$$

Syntax

```
[Sn,R]=dordom(u,y,i);
[Sn,R]=dordom(u,y,i,Rold);
```

Inputs

u,y	The input and output data of the system to be identified.
i	The dimension parameter that determines the number of
	block rows in the processed Hankel matrices. This param-
	eter should be chosen larger than the expected system or-
	der. The optimal value has to be found by trial and error.
	Generally twice as large is a good starting value.

Rold Data structure obtained from processing a previous databatch with dordom containing the same items as R.

Outputs

Sn	Singular values bearing information on the order of the
	system.
R	Data structure used by $destac$ for the estimation of A and
	C or by a next call to dordom. This matrix contains the
	triangular factor, estimated column-space and additional
	information (such as i/o dimension etc.).

See also

dordpi, dordpo, dordrs, dordeiv, destac, destbd.

dordpi

Purpose

dordpi is a preprocessor function that extracts the column-space of the extended observability matrix from input/output data. Data from different experiments can be concatenated using the extra input argument R. The estimated column-space is used in the function destac to extract the matrices A and C. This function implements the past input MOESP algorithm which can be used for the output error identification problem.

Model structure:

$$x(k+1) = Ax(k) + Bu(k)$$

$$y(k) = Cx(k) + Du(k) + v(k)$$

where v(k) is zero-mean noise of arbitrary color, independent of the noise-free input u(k).

Syntax

```
[Sn,R]=dordpi(u,y,i);
[Sn,R]=dordpi(u,y,i,Rold);
```

Inputs

u, y
 The input and output data of the system to be identified.
 i The dimension parameter that determines the number of block rows in the processed Hankel matrices. This parameter should be chosen larger than the expected system order. The optimal value has to be found by trial and error. Generally twice as large is a good starting value.

Rold Data structure obtained from processing a previous databatch with dordpi containing the same items as R.

Outputs

Sn Singular values bearing information on the order of the system.

R Data structure used by destac for the estimation of A and C or by a next call to dordpi . This matrix contains the triangular factor, estimated column-space and additional information (such as i/o dimension etc.).

See also

dordom, dordpo, dordrs, dordeiv, destac, destbd.

dordpo

Purpose

dordpo is a preprocessor function that extracts the column-space of the extended observability matrix from input/output data. Data from different experiments can be concatenated using the extra input argument R. The estimated column-space is used in the function destac to extract the matrices A and C. This function implements the past output MOESP algorithm which can be used for the innovations model identification problem.

Model structure:

$$x(k+1) = Ax(k) + Bu(k) + w(k)$$

$$y(k) = Cx(k) + Du(k) + v(k)$$

where w(k), v(k) are zero-mean white noise sequences, independent of the noise-free input u(k).

Syntax

```
[Sn,R]=dordpo(u,y,i);
[Sn,R]=dordpo(u,y,i,Rold);
```

Inputs

u, y	The input and output data of the system to be identified.
i	The dimension parameter that determines the number of
	block rows in the processed Hankel matrices. This param-
	eter should be chosen larger than the expected system or-
	der. The optimal value has to be found by trial and error.
	Generally twice as large is a good starting value.
Rold	Data structure obtained from processing a previous data-
	batch with dordpo containing the same items as R .

Outputs

Singular values bearing information on the order of the system.
Data structure used by $destac$ for the estimation of A and C or by a next call to $dordpo$. This matrix contains the
triangular factor, estimated column-space and additional information (such as i/o dimension etc.).

See also

dordom, dordpi, dordrs, dordeiv, destac, destbd.

dordrs

Purpose

dordrs is a preprocessor function that extracts the column-space of the extended observability matrix from input/output data. Data from different experiments can be concatenated using the extra input argument R. The estimated column-space is used in the function destac to extract the matrices A and C. This function implements the reconstructed state MOESP algorithm which can be used for the output error identification problem.

Model structure:

$$x(k+1) = Ax(k) + Bu(k)$$

$$y(k) = Cx(k) + Du(k) + v(k)$$

where v(k) is zero-mean noise of arbitrary color, independent of the noise-free input u(k).

Syntax

```
[Sn,R]=dordrs(u,y,x,i);
[Sn,R]=dordrs(u,y,x,i,Rold);
```

Inputs

u, y	The input and output data of the system to be identified.
x	Reconstructed state.
i	The dimension parameter that determines the number of
	block rows in the processed Hankel matrices. This param-
	eter should be chosen larger than the expected system or-
	der. The optimal value has to be found by trial and error.
	Generally twice as large is a good starting value.
Rold	Data structure obtained from processing a previous data-
	batch with dordrs containing the same items as R .

Outputs

Sn	Singular values bearing information on the order of the
	system
R	Data structure used by $destac$ for the estimation of A and
	C or by a next call to dordrs. This matrix contains the
	triangular factor, estimated column-space and additional
	information (such as i/o dimension etc.).

See also

dordom, dordpi, dordpo, dordeiv, destac, destbd.

drpi

Purpose

Estimates in a recursive way the matrices of an LTI state space model in innovation form using the output of the dordpi, destac and destbd routines as initial guess.

Model structure:

$$x(k+1) = Ax(k) + Bu(k)$$

$$y(k) = Cx(k) + Du(k) + v(k)$$

where v(k) is zero-mean white noise sequence, independent of the noise-free input u(k).

Syntax

Inputs

u,y	The input and output data of the system to be identified.
i	The dimension parameter that determines the number of
	block rows in the processed Hankel matrices such as ws
	used in dordpi for the creation of R_i
n	Order of system to be estimated.
beta	Forgetting parameter for recursive algorithm $(0 < \beta < 1)$.
Ai,Bi,Ci,Di	Initial estimate of state space matrices. These matrices
	can for instance be obtained by using dordpi/destac/destbd
	on the first few samples.
Ri	Triangular factor from dordpi.

Outputs

A,B,C,D The estimated system matrices.

See also

drpo, dordpi, destac, destbd

drpo

Purpose

Estimates in a recursive way the matrices of an LTI state space model in innovation form using the output of the dordpo and dmodpo routines as initial guess. Model structure:

$$x(k+1) = Ax(k) + Bu(k) + w(k)$$

$$y(k) = Cx(k) + Du(k) + v(k)$$

where w(k), v(k) is zero-mean white noise sequences, independent of the noise-free input u(k).

Syntax

Inputs

u,y	The input and output data of the system to be identified.
i	The dimension parameter that determines the number of
	block rows in the processed Hankel matrices such as ws
	used in dordpo for the creation of R_i
n	Order of system to be estimated.
beta	Forgetting parameter for recursive algorithm $(0 < \beta < 1)$.
Ai,Bi,Ci,Di	Initial estimate of state space matrices. These matrices
	can for instance be obtained by using dordpo/destac/destbd
	on the first few samples.
Ri	Triangular factor from dordpo.

Outputs

A,B,C,D The estimated system matrices

See also

drpi, dordpo, destac, destbd

drslslin

Purpose

This function performs a recursive update of a discrete time state space system,

$$x(k+1) = Ax(k) + Bu(k)$$

$$y(k) = Cx(k) + Du(k) + v(k)$$

using the Separable Least Squares technique. For this, only the initial estimates of A and C are needed. The same function can also be used to initialize the matrices needed to start up the recursion.

Syntax

[A,B,C,D,hist] = drslslin(u,y,A,C)
[A,B,C,D,hist] = drslslin(u,y,A,C,K,model,partype,options,slsstate)
[slsstate] = drslslin(u,y,A,C,K,model,partype,'init')

Inputs

A,C Initial estimate of the state space matrices A and C The input and output data of the system to be optimized. u,y model Vector [fB,fD,fx,fK] specifying whether the matrix B, D, the initial state x_0 and the Kalman filter gain K should be estimated. Default is $\begin{bmatrix} 1 & 1 & 0 & 0 \end{bmatrix}$. It is recommended only to estimate the initial state if the data length is short compared to the largest time constant of the system. This vector consists of parameters that can be used to inoptions fluence the optimization process. options(1) Display parameter (Default:0). 1 displays some results. options(2) is the step size parameter. options(3) is a forgetting factor of the nonlinear param. options(4) is a forgetting factor of the linear param.

Outputs

A,B,C,D Estimated state space matrices.

x0 Initial state. If it is not estimated, this vector will be returned as an empty matrix.

K Kalman gain. Same here.

hist History of the recursion the first column is the value of the cost-function at every step. the other columns are the estimated parameters at every step.

See also

dslslin

dslslin

Purpose

Performs a Least Squares optimization of a discrete time linear state space system system with model structure:

$$x(k+1) = Ax(k) + Bu(k) + Ke(k)$$

$$y(k) = Cx(k) + Du(k) + e(k)$$

First, the state space matrices are parameterized. In order to minimize the number of parameters, the Separable Least Squares technique is used. This allows the cancellation of the parameters of B and D, such that only the parameters that describe A and C need to be optimized. The parameterized model is optimized with the leastsq function from the MATLAB optimization toolbox. If needed also the initial state and a Kalman gain can be optimized.

Syntax

```
[A,B,C,D]=dslslin(u,y,A,C)
[A,B,C,D,x0,K,options] = dslslin(u,y,A,C,K,model,partype,options)
```

Inputs

The input and output data of the system to be optimized.

A,C Initial estimates of the system matrices A, and C.

Wector with flags that specify the kind of model to use. model(1) specifies if matrix B should be estimated. model(2) specifies if the initial state x_0 should be estimated. model(4) specifies if the Kalman filter gain K is estimated. Default is $\begin{bmatrix} 1 & 1 & 0 & 0 \end{bmatrix}$. It is recommended only to estimate the initial state if the data length is short compared to the largest time constant of the system.

Partype This parameter specifies the type of parameterization that

This parameter specifies the type of parameterization that is used to parameterize the state space model. Two types of parameterization are supported: 'on'= Output Normal and 'tr'=TRidiagonal.

Input parameters that are passed on directly to the optimization function from the Optimization Toolbox. See foptions for more information.

Outputs

options

A,B,C,D System matrices of the optimized linear model. If B or D is not estimated, it will be returned as an empty matrix.

 x_0 Estimate of the initial state. If the x_0 matrix is not esti-

mated, it will be returned empty.

K Estimate of the initial state. Same here.

options Output parameters from the Optimization Toolbox. See

foptions.

See also

See also: leastsq, foptions

dslswie

Purpose

Separable Least Squares optimization of a wiener model. Model structure:

$$\begin{array}{rcl} x(k+1) & = & Ax(k) + Bu(k) \\ y(k) & = & Cx(k) + Du(k) + v(k) \\ z(k) & = & f(y(k)) \end{array}$$

First, the state space matrices are parameterized. In order to minimize the number of parameters, the Separable Least Squares technique is used. This allows the cancellation of the parameters of the nonlinearity, such that only the parameters that describe the linear part need to be optimized. The parameterized model is optimized with the leastsq function from the MATLAB optimization toolbox.

Syntax

[A,B,C,D,x0,thl,options] = dslswie(u,z,A,B,C,D,x0,nn,model,options)

Inputs

u,z	The input and output data of the system to be optimized.
A,B,C,D	Initial estimates of the linear part of the wiener model.
x0	Initial condition, This is optional.
nn	The order of the Chebychev polynomials in the static non-
	linearity.
model	Vector with flags that specify the kind of model to use.
	model(1) specifies if B should be estimated. $model(2)$
	specifies if D should be estimated. model(3) specifies
	if the initial state x_0 should be estimated. Default is
	[1 1 0]. It is recommended only to estimate the
	initial state if the data length is short compared to the
	largest time constant of the system.
partype	This parameter specifies the type of parameterization that
	is used to parameterize the state space model. Two types
	of parameterization are supported: 'on'= Output Normal
	and 'tr'=TRidiagonal.
options	Input parameters that are passed on directly to the op-
	timization function from the Optimization Toolbox. See

Outputs

A,B,C,D System matrices of the optimized linear model. If the B or D matrix is not estimated, it will be zero.

foptions for more information.

Estimated initial state. If x_0 is not estimated it will be returned as an empty matrix. x0

options Output parameters from the Optimization Toolbox. See

foptions.

See also

foptions, dslslin

dss2th

Purpose

This function converts a discrete time state space model to a parameter vector that describes the model Model structure:

$$x(k+1) = Ax(k) + Bu(k) + Ke(k)$$

$$y(k) = Cx(k) + Du(k) + e(k)$$

Syntax

[theta,T,params] = dss2th(A,C,partype)
[theta,T,params] = dss2th(A,B,C,D,partype)
[theta,T,params] = dss2th(A,B,C,D,x0,K,partype)

Inputs

A,B,C,D System matrices describing the state space system. The

B and D matrices are optional and can be left out or given as an empty matrix to indicate it is not part of the

model.

x0 Initial condition, This is optional.

K Kalman gain. Also this matrix is optional.

This parameter specifies the type of parameterization that

is used to parameterize the state space model. Two types of parameterization are supported: 'on'= Output Normal

and 'tr'=TRidiagonal.

Outputs

theta Parameters vector describing the system.

params A structure that contains the dimension of the system,

such as the order, the number of inputs, whether D, x_0

or K is present, etc.

Transformation matrix between the input state space sys-

tem and the state space system in the form described by

theta. (the one that is constructed by dth2ss

See also

dth2ss

dth2ss

Purpose

This function converts a parameter vector that describes a discrete time state space model in output normal form to the state space matrix of that model. Model structure:

$$x(k+1) = Ax(k) + Bu(k) + Ke(k)$$

$$y(k) = Cx(k) + Du(k) + e(k)$$

Syntax

[A,B,C,D,x0,K] = dth2ss(theta,params)
[A,C] = dth2ss(theta,params)

Inputs

theta Parameter vector describing the system.

params A structure that contains the dimension parameters of the

system, such as the order, the number of inputs, whether

D, x0 or K is present in the model, etc.

T Transformation matrix to be applied to the state space

system that is constructed from theta. This transformation might come from the function dss2th and can be used to reconstruct the original state space matrices that

were given to dss2th.

Outputs

A,B,C,D System matrices describing the state space system in out-

put normal form. If theta does not contain the parameters for a matrix, this matrix will be returned as an empty

matrix.

x0 Initial state. If theta does not contain parameters for x_0 ,

this vector will be returned as an empty matrix.

K Kalman gain. Same here.

See also

dss2th

kronekf

Purpose

Calculates the Kronecker canonical form from a regular pencil A,B such that

$$A_{a} = QAZ = \begin{bmatrix} A_{k} & 0 \\ 0 & I \end{bmatrix}$$

$$B_{b} = QBZ = \begin{bmatrix} I & 0 \\ 0 & B_{k} \end{bmatrix}$$

where the eigenvalues of As and Bs are split according to alpha and option

Syntax

[AA,BB,Q,Z,na,nb]=kronekf(A,B,alpha,option)

Inputs

A,B The given matrix pencil.

alpha The value used to split the eigenvalues of the pencil A

and B. Default value is 1.

option This parameter can be either 'circle' or 'halfplane'. 'circle'

sorts the eigenvalues in A_k to be absolutely smaller than alpha, and those in B_k to be larger than alpha. 'halfplane' sorts the eigenvalues in A_k to have smaller real part than alpha, and those in B_k to have larger real part. Default

is 'circle'.

Outputs

AA,BB The pencil in canonical form. Q The required left transformations. Z The required right transformations. na Dimension of the matrix A_k . nb Dimension of the matrix B_k .

See also

ncdestac

ncdestac

Purpose

Estimates the system matrices A_c , A_a , C_c and C_a of a non-causal LTI state space model using the output of one of the dordxx preprocessor routines. The model is divided in a causal part and an anti-causal part. The causal part is stable and can be simulated forward in time. The anti-causal part can only be simulated stably backward in time. The other matrices are estimated with ncdestbd. The model can be simulated with ncdlsim.

Model structure:

$$\begin{array}{rcl} x_c(k+1) & = & A_c x_c(k) + B_c u(k) & \text{(causal part)} \\ x_a(k-1) & = & A_a x_a(k) + B_a u(k) & \text{(anti-causal part)} \\ y(k) & = & C_c x_a(k) + C_a x_a(k) + D u(k) \end{array}$$

All preprocessor functions can be used for the causal case as well as the non-causal case. For information about the possible disturbance signals see the help pages for the preprocessor dordxx functions.

Syntax

[Ac, Aa, Cc, Ca] = ncdmod(R, n)

Inputs

R Data structure obtained from a dordxx function, contain-

ing the triangular factor and additional information (such

as i/o dimension etc.).

Order of system to be estimated.

Outputs

Ac, Aa, Cc, Ca Estimated system matrices.

See also

ncdestbd, ncdlsim

ncdestbd

Purpose

Estimates the matrices B_c , B_a and D of a non-causal state space model, using the knowledge of the matrices A_c , A_a , C_c and C_a . This function is able to concatenate different data batches, through the matrices R, $R_{\rm old}$.

Model structure:

$$x_c(k+1) = A_c x_c(k) + B_c u(k)$$
 (causal part)
 $x_a(k-1) = A_a x_a(k) + B_a u(k)$ (anti-causal part)
 $y(k) = C_c x_a(k) + C_a x_a(k) + D u(k)$

 B_c , B_a and D are calculated by solving a linear least squares problem. The influence of the initial state x_0 in the data batches is compensated for in the solution. x_{0_c} and x_{0_a} can also be estimated.

Syntax

[Bc,Ba,D,x0c,x0a,R]=ncdestbd(u,y,Ac,Aa,Cc,Ca,model,Rold,iv,niv);
[Bc,Ba,D]=ncdestbd(u,y,Ac,Aa,Cc,Ca);

Inputs

u,y	The input and output data of the system to be identified.
Ac,Ae	The estimated system matrices A_c , A_e , C_c and C_a of the
Cc,Ca	non-causal state space system matrices.
model	Two element vector $\begin{bmatrix} fB & fD & fx \end{bmatrix}$ indicating whether
	B_c , B_a , D and x_{0_c} , x_{0_a} should be estimated. Default
	value is $\begin{bmatrix} 1 & 1 & 0 \end{bmatrix}$.
Rold	R matrix obtained from previous data batch. This vari-
	able can be used to process data in batches, or to combine
	data from different experiments.
iv	Instrumental variable. For instance, for the errors-in-
	variables case the iv can be the past output or for closed
	loop data, the reference input.
niv	Three element vector describing the number of lagged
	IVs used. niv(1) is the number of lagged IVs, niv(2) the
	number of lagged past outputs, and niv(3) the number of
	lagged past inputs. If only one element is present, no past
	data is used. If not given or empty appropriate default
	values are used. When past data is used as instrumental
	variable, about half of the input/output data is used for
	the instrument.

Outputs

Bc,Ba,D The estimated system matrices B_c , B_a and D. x0c,x0c The estimated initial state of the system.

R Compressed data matrix, storing information on the cal-

culation of the matrices B_c , B_a and D in a following ncdestbd. Used when analyzing multiple input-output

data sequences. $\,$

See also

ncdlsim, ncdestac

ncdlsim

Purpose

This function simulates a non-causal, unstable or unproper system. The model is divided in a causal part, and an anti-causal part. The causal part is stable and can be simulated forward in time. The anti-causal part can only be simulated stably backward in time. The system can be given in the following forms Non causal state space form:

$$x_c(k+1) = A_c x_c(k) + B_c u(k)$$
 (causal part)
 $x_a(k+1) = A_a x_a(k) + B_a u(k)$ (anti-causal part)
 $y(k) = C_c x_c(k) + C_a x_a(k) + Du(k)$

Unstable state space form:

$$x(k+1) = Ax(k) + Bu(k) + w(k)$$

$$y(k) = Cx(k) + Du(k) + v(k)$$

Non-proper transfer function:

$$a_n y(k+n) + \dots + a_0 y(k) = b_m u(k+m) + \dots + b_1 u(k+1) + b_0 u(k)$$

Syntax

[y,x]=ncdlsim(Ac,Aa,Bc,Ba,Cc,Ca,D,u,xc0,xa0)
[y,x]=ncdlsim(A,B,C,D,u,x0)
[y,x]=ncdlsim(num,den,u)

Inputs

Ac,Aa,Bc,Ba	State space matrices representing a non-causal
Cc,Ca,D	state space model.
A,B,C,D	State space matrices representing a possibly unstable state
	space model.
num, den	Numerator and denominator of possibly non-proper trans-
	fer function.
u	Input to the system.
xc0,xa0	Initial states of causal and anti-causal part of the non-
	causal state space model.
x0	Initial state of the state space model.

Outputs

y Simulated output.

x Simulated state of the state space model. The first n_c columns are the states of the causal part, the rest are the states of the anti-causal part.

See also

ncdestac, ncdestbd, dlsim

orderselect

Purpose

Gives an estimate of the order of a system based on the singular values. Two methods are available: "manual" and "largest-gap". The manual method shows a semi-logarithmic plot of the singular values and lets the user manually choose the order by inspection. The largest-gap method simply selects the order to be the one after which the largest gap occurs in the semi-logarithmic plot.

Syntax

order=orderselect(S,method)

Inputs

S Vector with singular values, obtained from one of the pre-

processor functions dordxx(dordom, dordpi, etc).

method Method for selecting the order. Possible methods are:

"manual" and "largest-gap". Default is "manual".

Outputs

order Selected model order.

See also

moesp, dordpo, dordpi

prbn

Purpose

Produces a binary sequence, with values 0 and 1. The chance of switching from level is given by the parameter 'rate'. Rate=0 gives a constant value 0. Rate=1 gives a signal that changes constantly between 0 and 1. Any value in between results in a random binary sequence. This kind of test signal has been described in [?]

Syntax

y=prbn(N,rate);

Inputs

N Number of points.

rate Chance of the signal changing level at every sample. De-

fault is 0.5.

Outputs

y Random binary noise.

See also

shave

Purpose

This function is used for reducing spikes from a measured signal. The spikes of the signal are 'shaved' as follows:

- From the signal a trend is computed using a fourth-order Butterworth filter.
- The standard deviation of the trend-corrected, clipped signal is computed.
- Detection band is defined by the trend plus and minus a certain factor times the standard deviation. All samples that are outside this band are replaced using linear interpolation. This 'shaving' method has been described in [?].

Syntax

```
shave(Signal);
Shaved_signal=shave(Signal);
Shaved_signal=shave(Signal,factor,Wn,lo_lim,up_lim);
```

Inputs

Signal to be 'shaved' (column vector)

factor Multiplication factor which determines the width of the

detection band. When the detection is poor, you should change this factor. This argument is optional. Its default

value is 2.

Wn Cut-off frequency of the low-pass filter used for trend de-

termination. It must be in the range 0.0 < Wn < 1.0, with 1.0 corresponding to half the sample rate. This argument

is optional. Its default value is 0.01.

lo_lim, up_lim If these arguments are present, the signal is clipped to a minimum value of lo_lim and a maximum value of

up_lim before the 'shaving' starts.

Outputs

Shaved_signal 'Shaved' signal.

See also

tlsim

Purpose

Simulation of the time response of LTI continuous-time systems to arbitrary inputs. The input and simulated output are represented by sampled signals. Unlike lsim, where the sampling is assumed to be zero order or first order hold, the sampling in tlsim is assumed to be trapezoidal or Tustin's (hence the t in tlsim).

Syntax

```
[y,x]=tlsim(A,B,C,D,u,Ts,x0)
```

Inputs

A,B,C,D State space matrices of the LTI system.

u Input signal.Ts Sampling time.

x0 Initial state of the system.

Outputs

y Output of the LTI system. x State of the LTI system.

See also

lsim, dlsim

vaf

Purpose

Compute the percentage Variance Accounted For (VAF) between two signals. the VAF is calculated as:

$$1 - \frac{\text{variance}(y - y_{est})}{\text{variance}(y)} \times 100\%$$

The VAF of two signals that are the same is 100%. If they differ, the VAF will be lower. When y and y_{est} are matrices, the VAF is calculated for every column in y and y_{est} . The VAF is often used to verify the correctness of a model, by comparing the real output with the estimated output of the model.

Syntax

Inputs

Reference signal, often the real output

ye Second signal, often the estimated output of a model

Outputs

v VAF, computed for the two signals

See also