

### Worksheet n°5: Feedback control

Let a physical system be governed by the following equations

$$\frac{dw}{dt} = Aw + Bu, y = Cw + g$$

$$A = \begin{bmatrix} 1 & -10 \\ 10 & 1 \end{bmatrix}, B = \begin{pmatrix} -1 \\ -1 \end{pmatrix}, C = (1 \quad 1)$$

where  $u$  is a control signal subject to a noise  $v$ .

Octave:

```
A=[[1 -10];[10 1]]
B=[-1; -1]
C=[1 1]
eig(A) % eigenvalues of A
sys=ss(A,[B zeros(size(B))],C, [0 1]) % two inputs u and v, one output y
figure(1)
impulse(sys) % plot impulse response
```

A/ Temporal domain

a/ State-feedback and pole placement.

We look for a control law under the form:  $u = Kw + v$ . The closed-loop system is:

$$\frac{dw}{dt} = Aw + Bu = (A + BK)w + Bv$$

$$y = Cw + g$$

Find  $K$  so that the closed-loop eigenvalues (eigenvalues of  $A + BK$ ) are located at  $\lambda = -1 \pm i10$ .

Octave:

```
K=[9/5 11/5] % gains of controller
eig(A+B*K) % eigenvalues of closed-loop system
syssf=ss(A+B*K,[B zeros(size(B))],C,[0 1]) % two inputs v and g, one output y
figure(2)
impulse(syssf(1,1),'b') % impulse response of closed-loop system from input 1 (v) to output
% 1 (y)
hold on
K2=[10 10] % other control gains
```

```

eig(A+B*K2) % closed-loop eigenvalues

syssf2=ss(A+B*K2,[B zeros(size(B))],C,[0 1]) % two inputs v and g, one output y

impulse(syssf2(1,1),'r') % impulse response of closed-loop system from input 1 (v) to output
% (1) y

%%

dt=0.01 % sampling time

t=0:dt:1000; % time samples

S=0.01; % PSD of white noise

variance=S/dt; % variance of white noise

v=sqrt(variance)*randn(size(t)); % white noise of PSD (S)

[yy,tt]=lsim(syssf(1,1),v,t); % generate output y from noise v with close-loop system

figure(3)

plot(tt,v,'g') % plot noise

hold on

plot(tt,yy,'k'); % plot output y of closed-loop system

std(yy) % standard deviation of output

norm(syssf(1,1))*sqrt(S) % 2-norm of impulse response times sqrt(PSD)

%%

[yy2,tt2]=lsim(syssf2(1,1),v,t); % generate output y from noise v with close-loop system

plot(tt2,yy2,'m'); % plot output y of closed-loop system

std(yy2) % standard deviation of output

norm(syssf2(1,1))*sqrt(S) % 2-norm of impulse response times sqrt(PSD)

%%

```

b/ Observer-feedback and pole placement.

Introducing an estimated state for the control input ( $u = Kw_e + v$ ), the governing equation reads:

$$\dot{w} = Aw + BKw_e + Bv, \quad y = Cw + g$$

A dynamic observer may be obtained by determining  $L$  such that

$$\dot{w}_e = Aw_e + BKw_e - L(y - y_e), \quad y = Cw + g, \quad y_e = Cw_e.$$

The estimation error  $e = w - w_e$  is governed by  $\dot{e} = \dot{w} - \dot{w}_e = (A + LC)e + (B - L)\begin{pmatrix} v \\ g \end{pmatrix}$ .

$L$  needs to be chosen so that  $A + LC$  be stable. Find  $L$  so that the eigenvalues of  $A + LC$  are located at  $\lambda = -1 \pm i10$ .

Octave:

```
L=[-11/5; -9/5] % observer gains
eig(A+L*C) % eigenvalues of equation governing error
sysdo=ss(A+B*K+L*C,-L,eye(size(A)),zeros(2,1)) % one input y, two outputs w1 and w2
figure(4)
impulse(sysdo,'b') % impulse response of observer
hold on
L2=[-9; -9] % alternative gains
eig(A+L2*C) % eigenvalues of equation governing error
sysdo2=ss(A+B*K+L2*C,-L2,eye(size(A)),zeros(2,1)) % one input y, two outputs w1 and w2
impulse(sysdo2,'r') % impulse response of observer
```

c/ The compensator (combining the estimator and the controller) is given by:

$$\dot{w}_e = (A + BK + LC)w_e - Ly \\ u = Kw_e + v$$

Octave:

```
sysc=ss(A+B*K+L*C,[-L zeros(size(L))],K,[0 1]) % compensator, two inputs (y, v), one output
% u
figure(5)
impulse(sysc) % impulse response
eig(A+B*K+L*C) % eigenvalues of compensator
```

d/ The closed-loop system is:

$$\begin{pmatrix} \dot{w} \\ w_e \end{pmatrix} = \underbrace{\begin{pmatrix} A & BK \\ -LC & A + BK + LC \end{pmatrix}}_{A_{cl}} \begin{pmatrix} w \\ w_e \end{pmatrix} + \underbrace{\begin{pmatrix} B & 0 \\ 0 & -L \end{pmatrix}}_{B_{cl}} \begin{pmatrix} v \\ g \end{pmatrix}, \quad \begin{pmatrix} u \\ y \end{pmatrix} = \underbrace{\begin{pmatrix} 0 & K \\ C & 0 \end{pmatrix}}_{C_{cl}} \begin{pmatrix} w \\ w_e \end{pmatrix} + \begin{pmatrix} v \\ g \end{pmatrix}$$

Octave:

```
Acl=[[A B*K];[-L*C A+B*K+L*C]]
Bcl=[[B zeros(size(B))];[ zeros(size(B)) -L]]
Ccl=[[zeros(size(C)) K];[C zeros(size(C))]]
syscl=ss(Acl,Bcl,Ccl,eye(2,2)) % closed-loop system, two inputs v and g, two outputs u
% and y
```

```

eig(Acl) % closed-loop eigenvalues

%%

figure(6)

[y,tim]=impulse(syscl); % impulse responses of closed-loop system

plot(tim(:,y(:,2,1), 'b') % plot impulse response from input 1 ( $v$ ) to output 2 ( $y$ )

hold on

%%

Acl2=[[A B*K2];[-L2*C A+B*K2+L2*C]] % closed-loop system with alternative gains

Bcl2=[[B zeros(size(B))];[ zeros(size(B)) -L2]]

Ccl2=[[zeros(size(C)) K2];[C zeros(size(C))]]

syscl2=ss(Acl2,Bcl2,Ccl2,eye(2,2))

eig(Acl2)

%%

[y2,tim2]=impulse(syscl2,tim) ; % impulse responses of closed-loop system

plot(tim2(:,y2(:,2,1),'r') % plot impulse response from input 1 ( $v$ ) to output 2 ( $y$ )

%%

[y3,tim3]=impulse(syssf(1,1),tim); % impulse response of state-feedback controller from
%  $v$  to  $y$ 

plot(tim3(:,y3(:,1),'k') % plot impulse response of state-feedback controller from
% input  $v$  to output  $y$ 

%%

norm(syscl(2,1)) % norm of impulse response from input 1 ( $v$ ) to output 2 ( $y$ )

norm(syscl2(2,1)) % same but with alternative compensator

norm(syssf(1,1)) % same with state-feedback controller

%%

[yy3,tt3]=lsim(syscl(2,1),v,t); % generate output  $y$  from noise  $v$  with close-loop system

figure(3)

plot(tt3,yy3,'b'); % plot output  $y$  of closed-loop system

```

```

hold on;

std(yy3) % standard deviation of output

norm(syscl(2,1))*sqrt(S) % 2-norm of impulse response times sqrt(PSD)

%%

[yy4,tt4]=lsim(syscl2(2,1),v,t); % same with alternative compensator

plot(tt4,yy4,'r'); % same with alternative compensator

std(yy4) % standard deviation of output

norm(syscl2(2,1))*sqrt(S) % 2-norm of impulse response times sqrt(PSD)

%%

pkg load all;

[spectra,freq]=pwelch(yy3,1000,0.5,1000,1/dt);% compute frequency spectrum of output y

% MATLAB: [spectra,freq]=pwelch(yy3,1000,500,1000,1/dt);

figure(7)

loglog(freq*2*pi,abs(spectra)) % plot frequency spectrum

```

## B/ Frequency space

### a/ Physical system.

Take the Laplace transform of the equations governing the physical system:

$$\frac{dw}{dt} = Aw + Bu, \quad y = Cw + g$$

and determine the transfer functions between  $(u, g)$  and  $y$ .

The transfer-function between  $u$  and  $y$  is denoted  $P(s)$ . What are the poles and zeros of this transfer function?

Compare the result with Octave:

```

tf(sys)

P=tf(sys(1,1)) % open-loop transfer function P(s) between u and y.

pole(P) % poles of P(s)

zero(P) % zeros of P(s)

figure(8)

bode(P) % Plot magnitude and phase of transfer function between u and y.

```

b/ What is the transfer-function  $K(s)$  of the compensator (defined in A/c/) between  $y$  and  $u$  ?

Octave:

```
tf(sysc)
K=tf(sysc(1,1)) % transfer-function K(s) of compensator between y and u.

pole(K) % poles of K(s)

zero(K) % zeros of K(s)

figure(9)

bode(K) % Plot magnitude and phase of transfer function between y and u.
```

c/ Closed-loop system

```
cltf=tf(syscl) % 4 transfer functions of closed-loop system

get(cltf) % properties of cltf

cltf(1,1).num % numerator of closed-loop transfer function from v to u

cltf(1,1).den % denominator of closed-loop transfer function from v to u

pole(cltf(1,1)) % poles of closed-loop transfer function from v to u

pole(cltf(1,2)) % poles of closed-loop transfer function from g to u

pole(cltf(2,1)) % poles of closed-loop transfer function from v to y

pole(cltf(2,2)) % poles of closed-loop transfer function from g to y

zero(1-P*K) % should be compared to previous poles

figure(10)

bode(cltf(1,1)) % bode plot from from v to u % control cost assessment

figure(11)

bode(cltf(2,1)) % bode plot from from v to y

% performance assessment, compare to figure 7
```

d/ Robustness

Find largest  $a$  satisfying  $0 < a < 1$ , such that  $1 - aPK$  exhibits a zero with a positive real part.

Find smallest  $a$  satisfying  $a > 1$ , such that  $1 - aPK$  exhibits a zero with a positive real part.

Find smallest  $\phi$  satisfying  $\phi > 0$ , such that  $1 - e^{i\phi}PK$  exhibits a zero with a positive real part.