

```

% Problem 1
% H-inf state feedback
% Consider the general LTI system
clear global;
A = [-5 1 0;
      0 1 1;
      1 1 1];
B1 = [0.5;
      0;
      0.3];
B2 = [0 0;
      0 1;
      1 0];
C = [1 0 0;
      0 2 1];

% a)
% Implement the  $H_\infty$  LMI synthesis feasibility problem for a given attenuation level  $\gamma$  as
% a function and design a full state ( $y = x$ ) feedback control law  $u = Kx$  such that the
% closed loop system is stable and the transfer function matrix satisfies
%  $\|G_{zw}\|_\infty < 0.5$ .

K = Hinf_LMI_feasy_p(A, B1, B2, C, 0, 0)

```

Solver for LMI feasibility problems $L(x) < R(x)$
 This solver minimizes t subject to $L(x) < R(x) + t*I$
 The best value of t should be negative for feasibility

Iteration : Best value of t so far

1 -0.073393

Result: best value of t : -0.073393
 f-radius saturation: 0.000% of $R = 1.00e+09$

```

K = 2x3
    2.1049   -3.9716   -2.8954
   -1.4505   -5.0618   -2.7287

```

```

% b)
% Plot the regulated output responses  $z(t)$  to an impulse in  $w$  (use the subfigure command
% and include one signal per plot).

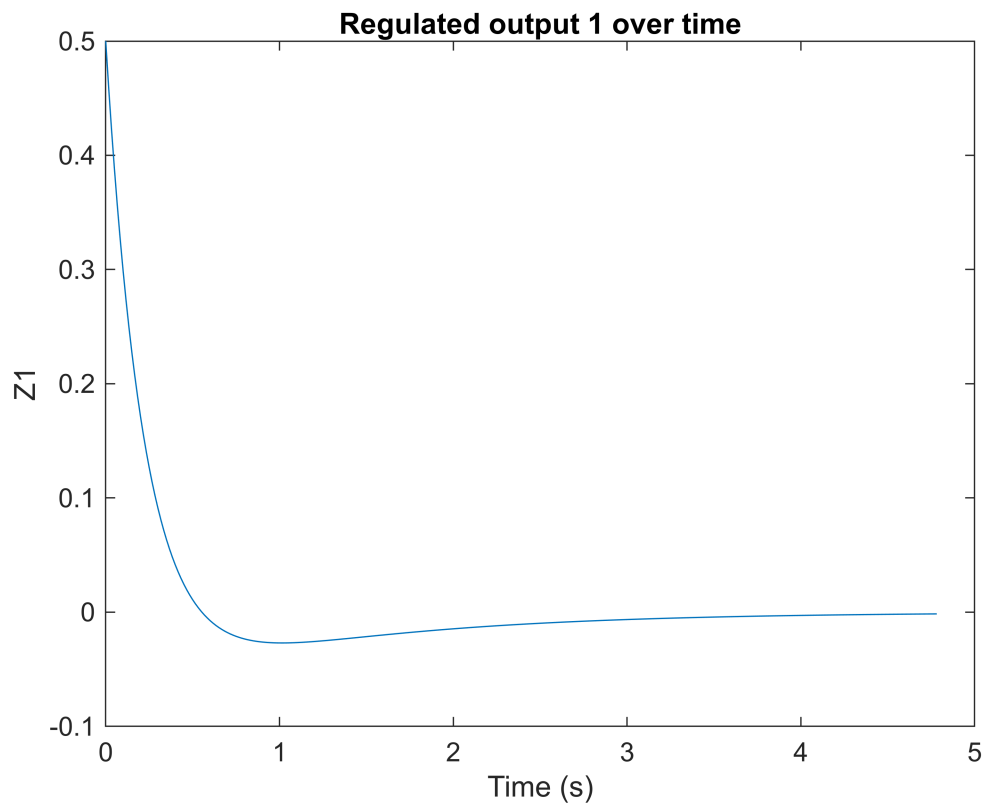
```

```

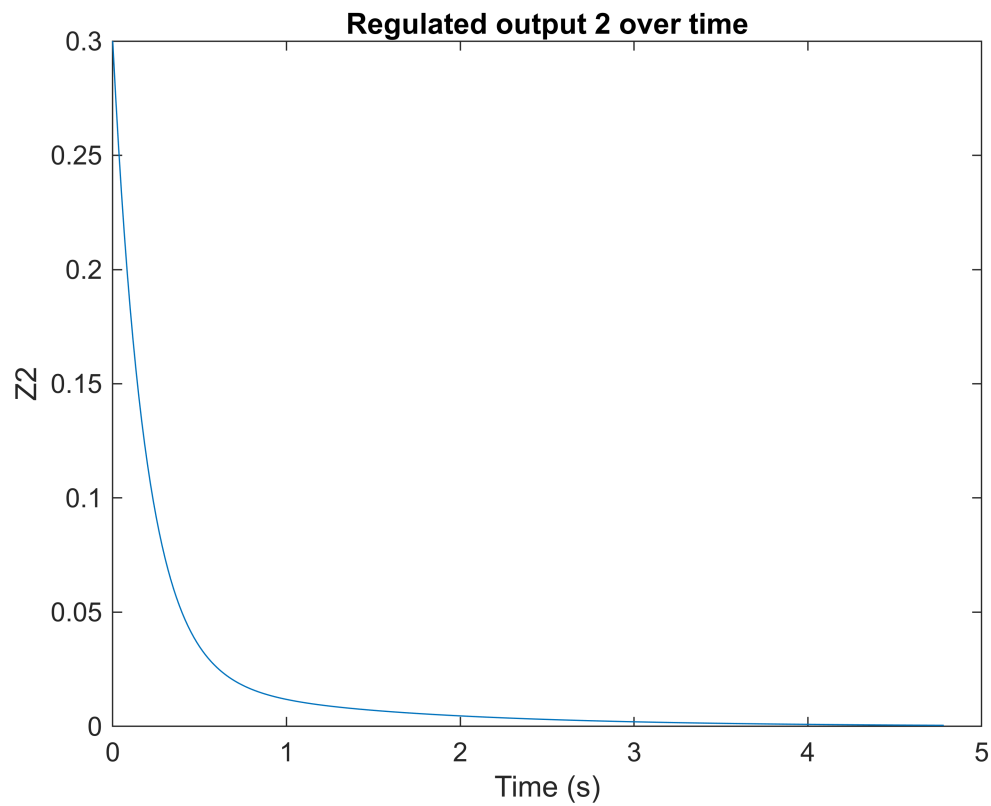
sys_wz = ss(A + (B2 * K), B1, C, 0);

[Z,T,X] = impulse(sys_wz);
figure();
plot(T, Z(:,1))
title("Regulated output 1 over time");
xlabel("Time (s)");
ylabel("Z1");

```

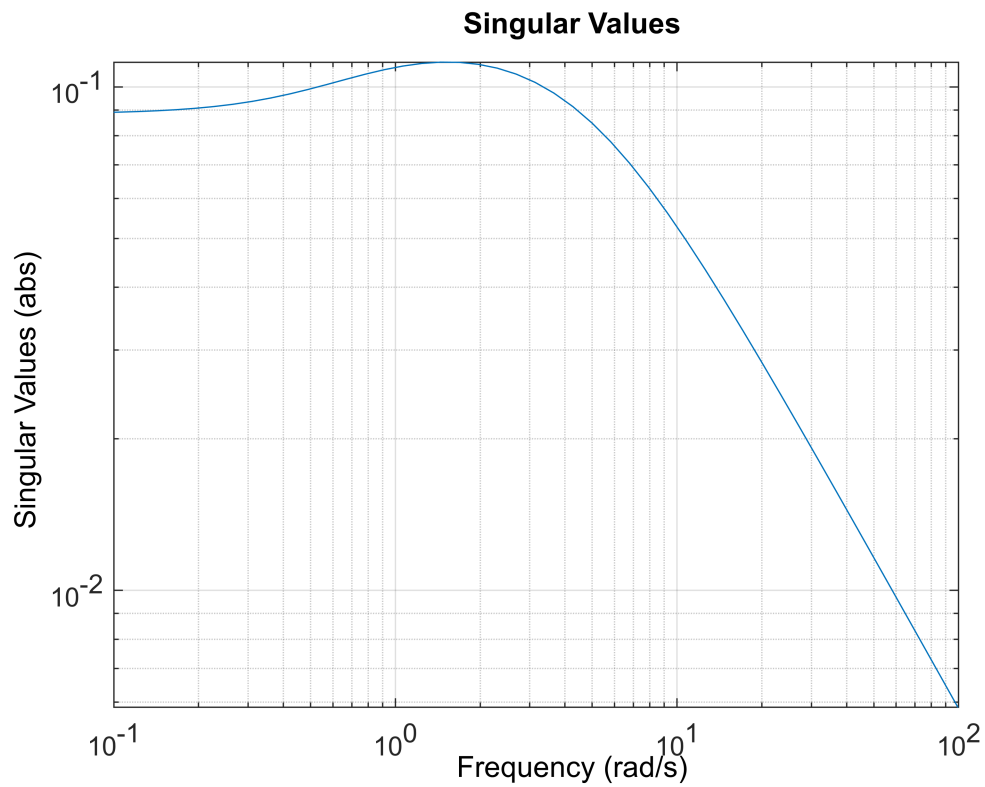


```
figure();  
plot(T, Z(:,2))  
title("Regulated output 2 over time");  
xlabel("Time (s)");  
ylabel("Z2");
```



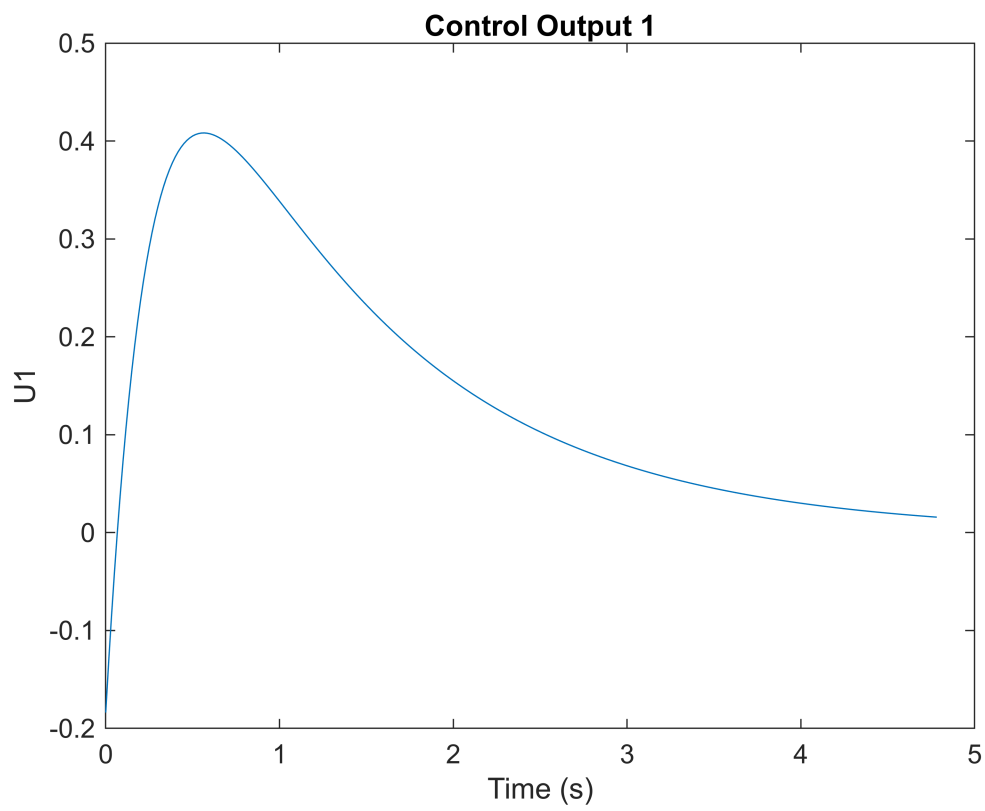
```
% c)
% Generate a max singular value plot of the closed loop system Gzw(s) using the command
% sigma. Does this system amplify (absolute gain > 1) or attenuate (absolute gain < 1)
% disturbances? Note that the sigma plot generates the gain in dB.

figure()
sigmaplot(sys_wz)
```

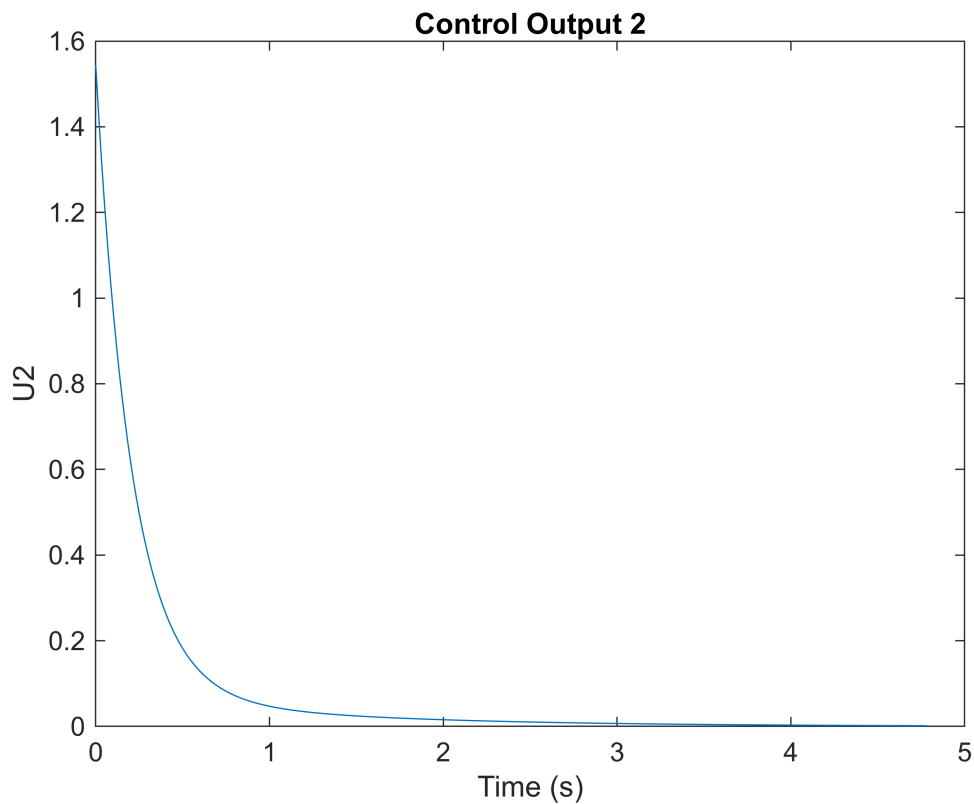


```
% d)
% Plot the two control signals u1(t) and u2(t) and compute their L2 norms. Which channel
% requires more input energy?
```

```
U = X * -K';
figure()
plot(T, U(:,1))
title("Control Output 1");
xlabel("Time (s)");
ylabel("U1");
```



```
figure()
plot(T, U(:,2))
title("Control Output 2");
xlabel("Time (s)");
ylabel("U2");
```



```
fprintf("Hinf U1 norm %f", norm(U(:,1)));
```

```
Hinf U1 norm 3.367674
```

```
fprintf("Hinf U2 norm %f", norm(U(:,2)));
```

```
Hinf U2 norm 4.135326
```

```
% Problem 2
% H-2 state feedback
% DC-8 general LTI system
% Define System Dynamics
clear global;

A = [-0.0869  0 0.039 -1 ;           % x1 = delta beta (rad)
      -4.424  -1.184 0 0.335;        % x2 = delta p (rad/s)
      0 1 0 0 ;                     % x3 = delta phi (rad)
      2.148 -0.021 0 -0.228];        % x4 = delta r (rad/s)
B1 = [0 0 0 0.288]';               % w = r_g (yaw rate gust, rad/s)
B2 = [ 0.0223 0.547 0 -1.169]';    % u1 = delta_r
C = eye(4);                        % C = I
D11 = zeros(4,1);
D12 = [0 0 0 0]';

% a)
```

```
% Implement the H2 LMI conditions derived in lecture for the feasibility problem given
% a prescribed attenuation level  $\|G(s)\|_2 < \gamma$  as a function using the LMI Toolbox in
% MATLAB. Design  $\gamma$  for the H2 controller to match the control energy (L2 norm) for an
% equivalent  $H_\infty$  controller with attenuation level  $\gamma = 2.5$ .
```

```
K_H2 = H2_LMI_feasy_p(A, B1, B2, C, D11)
```

```
Solver for LMI feasibility problems  $L(x) < R(x)$ 
This solver minimizes  $t$  subject to  $L(x) < R(x) + t*I$ 
The best value of  $t$  should be negative for feasibility
```

```
Iteration : Best value of t so far
```

```
1          0.074298
2         -0.055475
```

```
Result: best value of t: -0.055475
f-radius saturation: 0.000% of R = 1.00e+09
```

```
K_H2 = 1x4
      -8.8868    1.0178    2.2199    4.2856
```

```
% b)
% Generate the resulting singular value bode plots of the closed loop systems and the
% responses of the state  $x$  due to an impulse in the yaw disturbance  $rg$  for both the H2
% and  $H_\infty$  controllers and compare both sets of plots.
```

```
K_Hinf = Hinf_LMI_feasy_p(A, B1, B2, C, 0, 0)
```

```
Solver for LMI feasibility problems  $L(x) < R(x)$ 
This solver minimizes  $t$  subject to  $L(x) < R(x) + t*I$ 
The best value of  $t$  should be negative for feasibility
```

```
Iteration : Best value of t so far
```

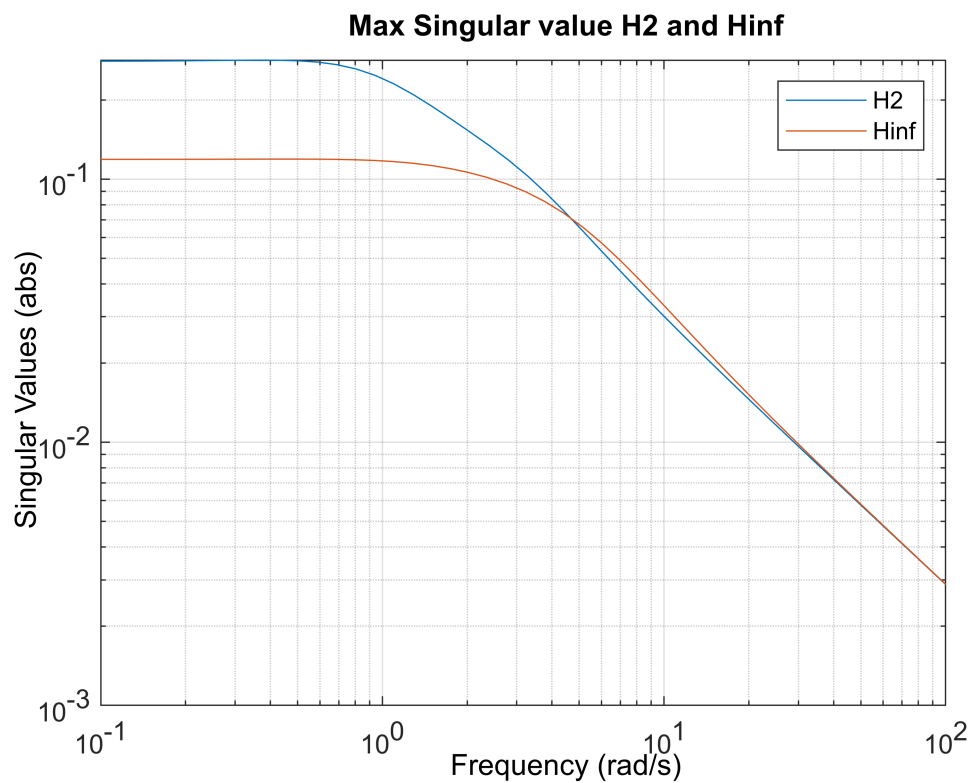
```
1          0.105809
2          0.044072
3          9.074935e-03
4          9.074935e-03
5         -0.035978
```

```
Result: best value of t: -0.035978
f-radius saturation: 0.000% of R = 1.00e+09
```

```
K_Hinf = 1x4
      -28.9398   10.6771   12.2423   13.3941
```

```
sys_wz_H2 = ss(A + (B2 * K_H2), B1, C, 0);
sys_wz_Hinf = ss(A + (B2 * K_Hinf), B1, C, 0);
```

```
figure()
hold on;
sigmaplot(sys_wz_H2)
sigmaplot(sys_wz_Hinf)
legend("H2", "Hinf")
title("Max Singular value H2 and Hinf");
```



% c) For a white noise yaw disturbance w of unit intensity, compute the average power in the % states for each of the closed loop systems and compare.

```
fprintf("Average power of state [H2] [Hinf]");
```

```
Average power of state [H2] [Hinf]
```

```
for i = (1:size(A, 2))
    fprintf("                %i: %f, %f\n", i, norm(sys_wz_H2(i)), norm(sys_wz_Hinf(i)));
end
```

```
1: 0.036724, 0.031283
2: 0.132822, 0.098753
3: 0.151861, 0.068890
4: 0.099762, 0.083213
```

Problem 3

H-inf observer design

Consider the General LTI system

$$\dot{x} = Ax + B_2u + B_1w$$

$$z = C_1x$$

$$y = C_2x + D_{21}w + D_{22}u$$

with state x , measured output y , control input u , disturbance w , and the regulated outputs

z . For this system, we introduce a full-order state observer in the following form:

$$\dot{\hat{x}} = A\hat{x} + B_2u + L(C_2\hat{x} + D_{22}u - y)$$

where \hat{x} is the state observation and L is the observer gain. The estimate of the regulated outputs is given by $\tilde{z} = C_1\hat{x}$, which is desired to have as small as possible influence from the disturbance w .

a)

Show that for

$$e(t) = x(t) - \hat{x}(t)$$

$$\tilde{z}(t) = z(t) - \hat{z}(t)$$

the resulting observation error equation is given by

$$\dot{e} = (A + LC_2)e + (B_1 + LD_{21})w$$

$$\tilde{z} = C_1e$$

and has closed loop transfer function $G_{\tilde{z}w} = C_1[sI - (A + LC_2)]^{-1}(B_1 + LD_{21})$

$$e(t) = x(t) - \hat{x}(t)$$

$$\dot{e}(t) = Ax + B_2u + B_1w - A\hat{x} - B_2u - L(C_2\hat{x} + D_{22}u - y)$$

$$\dot{e}(t) = Ax + B_1w - (A + LC_2)\hat{x} - LD_{22}u + Ly$$

$$\dot{e}(t) = Ax + B_1w - (A + LC_2)\hat{x} - LD_{22}u + L(C_2x + D_{21}w + D_{22}u)$$

$$\dot{e}(t) = (A + LC_2)x + B_1w - (A + LC_2)\hat{x} + LD_{21}w$$

$$\dot{e}(t) = (A + LC_2)(x - \hat{x}) + (B_1 + LD_{21})w$$

$$\dot{e}(t) = (A + LC_2)e + (B_1 + LD_{21})w$$

$$\tilde{z}(t) = z(t) - \hat{z}(t)$$

$$\tilde{z}(t) = C_1x - C_1\hat{x}$$

$$\tilde{z}(t) = C_1e$$

b) Consider the following problem: Given the system in (a) and positive scalar γ , find a matrix L such that $\|G_{z\tilde{w}}\|_{\infty} < \gamma$. Prove that this problem has a solution if and only if there exists a matrix W and a positive definite matrix P such that $P > 0$ and

$$\begin{pmatrix} A^T P + PA + C_2^T W^T + WC_2 & PB_1 + WD_{21} & C_1^T \\ (PB_1 + WD_{21})^T & -\gamma & 0 \\ C_1 & 0 & -\gamma \end{pmatrix} < 0$$

When such a pair of matrices W and P are found, the solution to the problem is given as

$$L = P^{-1}W$$

Starting from the Hinf State Feedback LMI we can substitute

$$\begin{pmatrix} A^T P + PA & PB & C^T \\ B^T P^T & -\gamma & D^T \\ C & D & -\gamma \end{pmatrix} < 0$$

$$A = (A + LC_2)$$

$$B = B_1 + LD_{21}$$

$$C = C_1$$

$$D_{11} = 0$$

$$\begin{pmatrix} (A + LC_2)^T P + P(A + LC_2) & PB_1 + PLD_{21} & C^T \\ (PB_1 + PLD_{21})^T & -\gamma & 0 \\ C & 0 & -\gamma \end{pmatrix} < 0$$

$$\begin{pmatrix} A^T P + PA + C_2^T W^T + WC_2 & PB_1 + WD_{21} & C_1^T \\ (PB_1 + WD_{21})^T & -\gamma & 0 \\ C_1 & 0 & -\gamma \end{pmatrix} < 0$$

```
clear global;
```

```
% b)
```

```
% c)
```

```
% Design an H $\infty$  observer according to the above approach such that  $\|G_{z\tilde{w}}\|_{\infty} < 0$ . For  
% the system in Problem 1. Assume that
```

```
A = [-5 1 0;  
      0 1 1;  
      1 1 1];
```

```
B1 = [0.5;  
      0;
```

```

    0.3];
B2 = [0 0;
      0 1;
      1 0];
C1 = [1 0 0;
      0 2 1];
C2 = [1 0 0;
      0 0 1];
D21 = [0 0]';

% Provide plots of the error states e1(t), e2(t) and e3(t) for 2 seconds for an impulse input
% in w.
L_Hinf = Hinf_observer_LMI_feasy_p(A, B1, C1, C2, D21)

```

Solver for LMI feasibility problems $L(x) < R(x)$
 This solver minimizes t subject to $L(x) < R(x) + t \cdot I$
 The best value of t should be negative for feasibility

Iteration : Best value of t so far

1	0.037035
2	-9.570941e-03

Result: best value of t : -9.570941e-03
 f-radius saturation: 0.000% of $R = 1.00e+09$

```

L_Hinf = 3x2
    2.0623   -2.4074
   -4.5237  -15.4874
   -3.0126   -8.2320

```

```

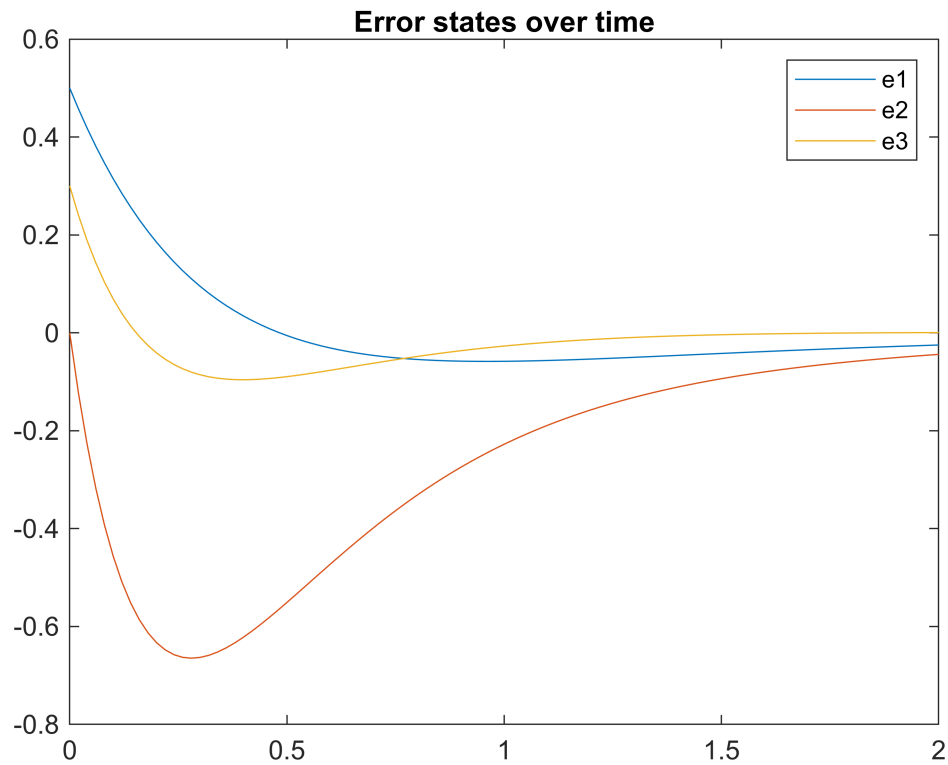
sys_observer = ss((A + L_Hinf*C2), (B1 + L_Hinf * D21), C1, 0);
[Z, T, E] = impulse(sys_observer, 2);

```

```

figure()
plot(T, E)
legend("e1", "e2", "e3")
title("Error states over time")

```



Functions

```
function k = Hinf_LMI_feasy_p(A, B1, B2, C1, D11, D12)
    % get the input, state sizes
    % needed to define P
    n_states = size(A, 2);
    n_inputs = size(B2, 2);

    gamma = 0.5;

    % setup LMI expression (in the heap or sumthin)
    setlmis([])

    W = lmivar(2, [n_inputs n_states]); % matrix
    X = lmivar(1, [n_states 1]); % lyapunov cost to go

    lmiterm([-1, 1, 1, X], 1, 1); % 0 < X [Condition 1: (1, 1)]

    lmiterm([2, 1, 1, X], A, 1, 's'); % AX + XA' < 0 [Condition 2: (1, 1)]
    lmiterm([2, 1, 1, W], B2, 1, 's'); % AX + XA' + W'B2' + B2W < 0

    lmiterm([2, 1, 2, 0], B1); % B1 < 0 [Condition 2: (1, 2)]
```

```

lmiterm([2, 1, 3, X'], 1, C1')           %  $X'C1' < 0$  [Condition 2: (1, 3)]
lmiterm([2, 1, 3, W'], 1, D12')          %  $X'C1' + W'D12' < 0$ 

% lmiterm([2, 2, 1, 0], B1')              %  $B1' < 0$  [Condition 2: (2, 3)]

lmiterm([2, 2, 2, 0], -gamma)             %  $-\gamma < 0$  [Condition 2: (2, 2)]

lmiterm([2, 2, 3, 0], D11')              %  $D11' < 0$  [Condition 2: (2, 3)]

% lmiterm([2, 3, 1, X], C1, 1)            %  $C1X < 0$  [Condition 2: (3, 3)]
% lmiterm([2, 3, 1, W], D12, 1)          %  $C1X + D12W < 0$ 

% lmiterm([2, 3, 2, 0], D11)              %  $D11 < 0$  [Condition 2: (3, 3)]

lmiterm([2, 3, 3, 0], -gamma)             %  $-\gamma < 0$  [Condition 2: (3, 3)]

lmi = getlmis;

[~,xopt] = feasp(lmi);                    % get tmin to check feasibility

w = dec2mat(lmi, xopt, W);
x = dec2mat(lmi, xopt, X);
k = w * x^-1;
end

function k = H2_LMI_feasy_p(A, B1, B2, C, D)
% get the input, state sizes
% needed to define P
n_states = size(A, 2);
n_inputs = size(B1, 1);

gamma = 2.5;
I = eye(4);
% setup LMI expression (in the heap or sumthin)
setlmis([])

Z = lmivar(1, [n_states 1]);              % matrix
W = lmivar(2, [1 n_inputs]);              % matrix
X = lmivar(1, [n_states 1]);              % states

lmiterm([-1, 1, 1, X], 1, 1);              %  $0 < X$  [Condition 1: (1, 3)]

lmiterm([2, 1, 1, X], A, 1, 's');          %  $AX + XA' < 0$  [Condition 2: (1, 3)]
lmiterm([2, 1, 1, W], B2, 1, 's');        %  $AX + XA' + W'B2' + B2W < 0$ 
lmiterm([2, 1, 1, 0], B1*B1');            %  $AX + XA' + W'B2' + B2W < 0$ 

lmiterm([3, 1, 1, Z], -1, 1);              %  $-Z < 0$  [Condition 3: (1, 2)]

lmiterm([3, 1, 2, X], C, 1)                %  $C1X < 0$  [Condition 3: (1, 2)]
lmiterm([3, 1, 2, W], D, 1)                %  $C1X + D12W < 0$ 

```

```

%      lmiterm([3, 2, 1, X'], 1, C)           %  $X'C1' < 0$            [Condition 3: (2, 2)]
%      lmiterm([3, 2, 1, W'], 1, D)           %  $X'C1 + W'D12' < 0$ 

lmiterm([3, 2, 2, X], -1, 1)                  %  $-X < 0$            [Condition 3: (2, 2)]

for i = (1:n_states)
    lmiterm([4, 1, 1, Z], I(i), I(i)');
end
lmiterm([-4, 1, 1, 0], gamma^2);

lmi = getlmis;

[~,xopt] = feasp(lmi);                        % get tmin to check feasibility

w = dec2mat(lmi, xopt, W);
x = dec2mat(lmi, xopt, X);
k = w * x^-1;
end

function l = Hinf_observer_LMI_feasy_p(A, B1, C1, C2, D)
    % get the input, state sizes
    % needed to define P
    n_states = size(A, 2);
    n_outputs = size(C2, 1);

    gamma = 0.1;

    % setup LMI expression (in the heap or sumthin)
    setlmis([])

    W = lmivar(2, [n_states n_outputs]);      % matrix
    X = lmivar(1, [n_states 1]);               % lyapunov cost to go

    lmiterm([-1, 1, 1, X], 1, 1);              %  $0 < X$            [Condition 1: (1, 1)]

    lmiterm([2, 1, 1, X], A', 1, 's');         %  $A'X + XA < 0$        [Condition 2: (1, 1)]
    lmiterm([2, 1, 1, W], 1, C2, 's');         %  $A'X + XA + W'C2' + WC2 < 0$ 

    lmiterm([2, 1, 2, X], 1, B1);              %  $XB1 < 0$            [Condition 2: (1, 2)]
    lmiterm([2, 1, 2, W], 1, D);              %  $XB1 + WD12 < 0$ 

    lmiterm([2, 1, 3, X'], 1, C1')             %  $C1' < 0$            [Condition 2: (1, 3)]

    lmiterm([2, 2, 2, 0], -gamma)              %  $-\gamma < 0$        [Condition 2: (2, 2)]
    %      lmiterm([2, 2, 3, 0], 0)             %  $0 < 0$            [Condition 2: (2, 3)]
    lmiterm([2, 3, 3, 0], -gamma)              %  $-\gamma < 0$        [Condition 2: (3, 3)]

    lmi = getlmis;

```

```
[~,xopt] = feasp(lmi); % get tmin to check feasibility

w = dec2mat(lmi, xopt, W);
x = dec2mat(lmi, xopt, X);
l = x^-1 * w;
end
```