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# MECH 6V29 - MPC - Homework 3

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## Problem 2

### 2a

```
A = [1, 1;
      0, 1];
B = [0.5;
      1];
C = eye(3,2); %<--- [1,0;0,1;0,0]
D(3,1) = 1; %<--- [0;0;1]
sys = ss(A,B,C,D,1)

N = 10;

% sizes
nx = size(A,1);
nu = size(B,2);
ny = size(C,1);

% controller
K = -acker(A,B,zeros(nx,1));

% sets
X = Polyhedron('A',[eye(nx);-eye(nx)], 'b', ones(2*nx,1));
U = Polyhedron('A',[1;-1], 'b', ones(2*nu,1));
W = B*Polyhedron('A',[1;-1], 'b', [0.3;0.3]);

sys =

      A =
           x1  x2
      x1    1    1
      x2    0    1
```

```
B =  
      u1  
x1  0.5  
x2   1  
  
C =  
      x1  x2  
y1   1   0  
y2   0   1  
y3   0   0  
  
D =  
      u1  
y1   0  
y2   0  
y3   1
```

*Sample time: 1 seconds*  
*Discrete-time state-space model.*

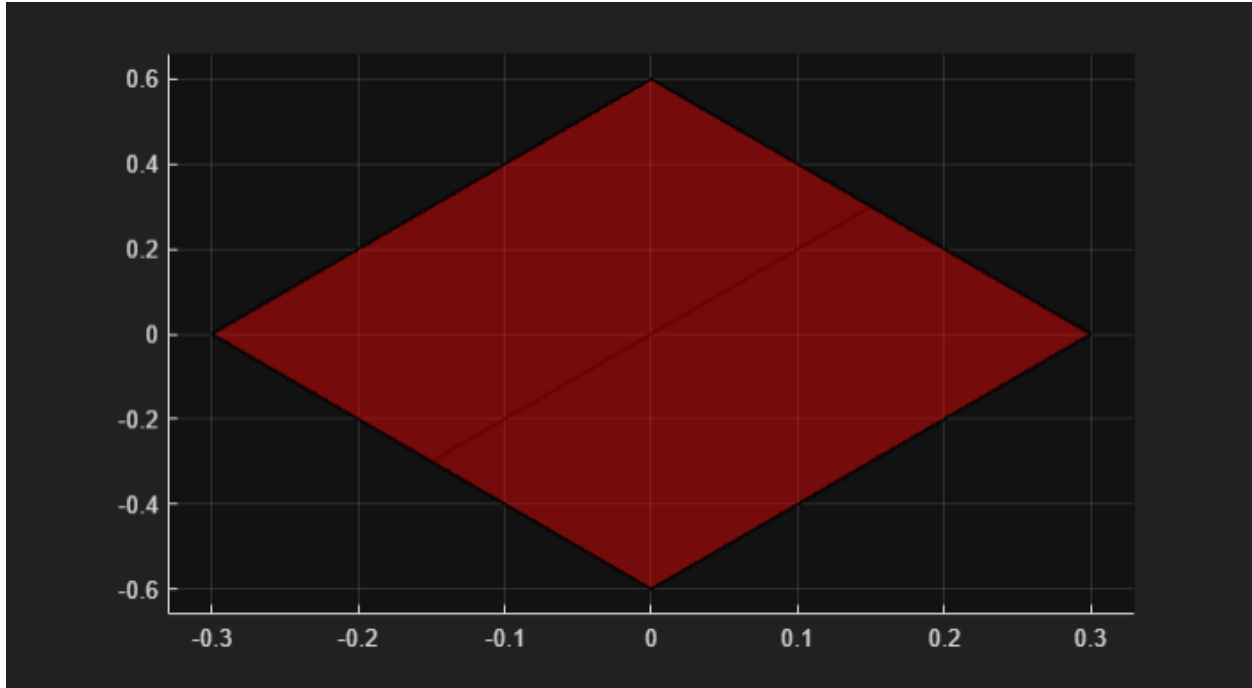
## 2b - RPI Set

```
A_K = A+B*K;  
F = W;  
F.minHRep;  
fig = figure; hold on;  
F.plot  
% drawnow  
for i = 1:5  
    F = F + (A_K)^(i)*W;  
    F.minHRep;  
    F.plot; alpha(0.1);  
    % drawnow  
end  
hold off  
saveas(fig, strcat('figs', filesep, 'pblm2b_1', '.png'));  
  
% Approx code  
epsilon = 1; %<== all epsilon smaller then 1 appear to make it good  
F_approx = Approx_RPI(A_K, W, epsilon);  
  
% Plot  
fig = figure; hold on  
F_approx.plot('color', 'blue'); alpha(1)  
  
F.plot; alpha(0.2);  
for i = 1:size(F.V,1)  
    plot(F.V(i,1), F.V(i,2), 'o');  
end  
saveas(fig, strcat('figs', filesep, 'pblm2b_2', '.png'))  
  
S =
```

1

 $s =$ 

2



## 2c - tightened state/input sets

```
Z = F_approx;
X_bar = X - Z; X_bar.minHRep;
U_bar = U - K*Z; U_bar.minHRep;
```

## 2d ----- Setup Controller

```
P=0;
Q = 1e-3*eye(nx);
R = 100;

yal mip('clear'); clear('controller');
u_bar_ = sdpvar(repmat(nu,1,N),ones(1,N));
x_bar_ = sdpvar(repmat(nx,1,N+1),ones(1,N+1));
x_1 = sdpvar(nx,1);
u_1 = sdpvar(nu,1);

constraints = []; objective = 0;
constraints = [constraints,Z.A*(x_bar_{1}-x_1) <= Z.b];
```

```
% constraints = [constraints, Z.A*x_bar_{1} <= Z.b]; %<-- initial condition
constraint
for k = 1:N
    objective = objective + x_bar_{k}'*Q*x_bar_{k} + u_bar_{k}'*R*u_bar_{k};
    constraints = [constraints, x_bar_{k+1} == A*x_bar_{k} + B*u_bar_{k}];
    constraints = [constraints, X_bar.A*x_bar_{k} <= X_bar.b];
    constraints = [constraints, U_bar.A*u_bar_{k} <= U_bar.b];
end
constraints = [constraints, Z.A*(x_bar_{k+1}+0)<= Z.b];
objective = objective + x_bar_{k+1}'*P*x_bar_{k+1};

constraints = [constraints, u_1 == u_bar_{1} + K*(x_1 - x_bar_{1})];

opts = sdpsettings;
controller = optimizer(constraints,objective,opts,x_1,u_1);
```

## 2e ----- Simulation

```
clear X U
for i = 1:100
    rng(i);
    x0 = zeros(nx,1); tf = 100;
    V = num2cell(0.6*rand(nx,tf)-0.3);
    [X{i},U{i},~] = run_sim(A,B,V,controller, x0, tf);
end
```

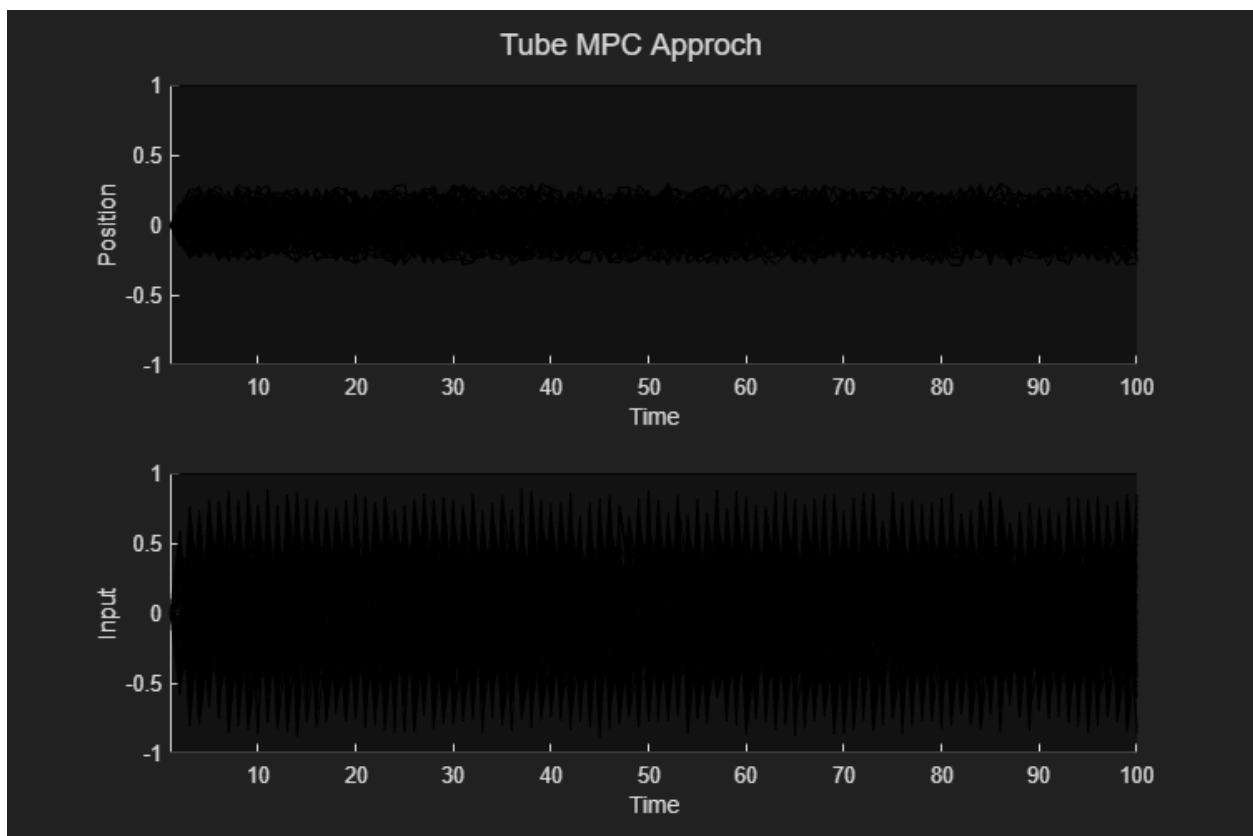
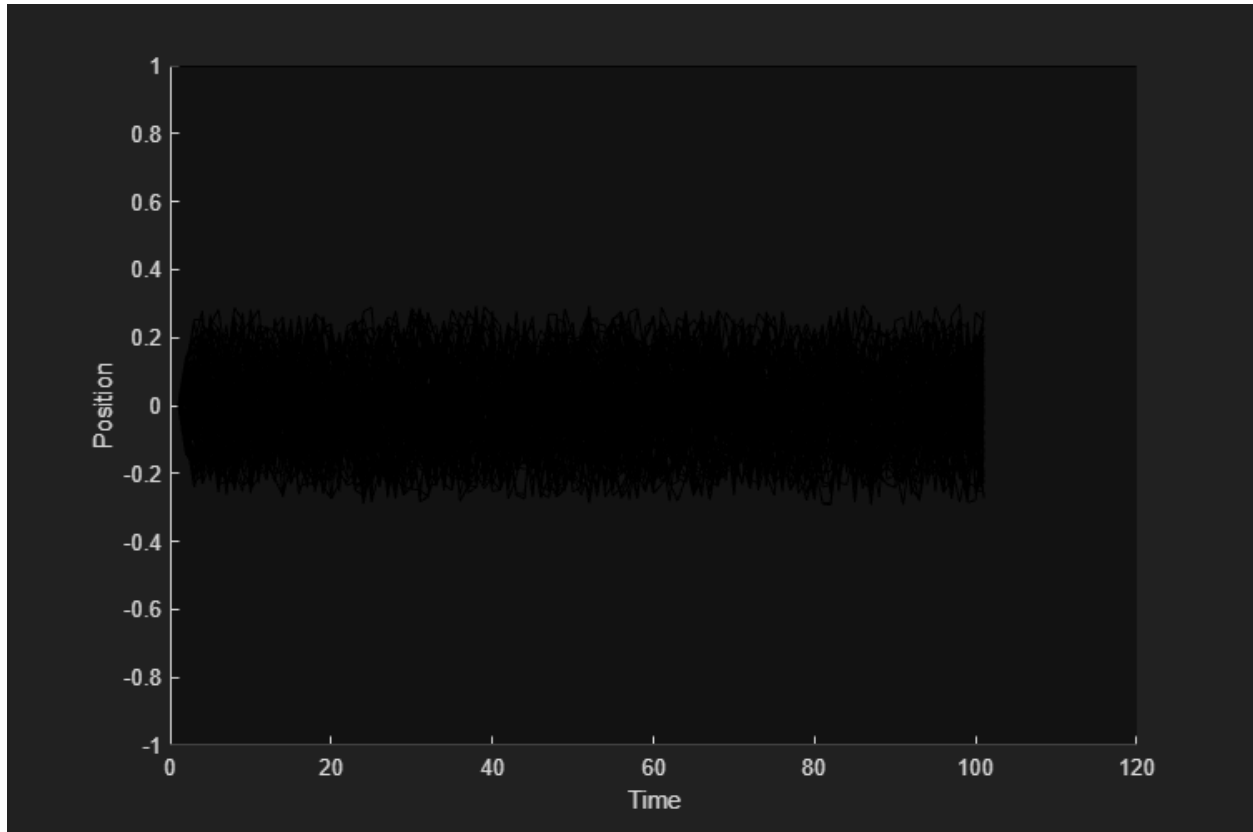
## Plotting

```
fig = figure(...
    WindowStyle="normal",...
    Position=[0 0 750 500]);

% States
subplot(2,1,1); hold on;
yline(1,'k'); yline(-1,'k');
ylabel('Position');
xlabel('Time');
xlim([1,100]);
for i = 1:length(X); plot(X{i}(1,:), 'k'); end

% Input
subplot(2,1,2); hold on;
yline(1,'k'); yline(-1,'k');
ylabel('Input');
xlabel('Time');
xlim([1,100]);
for i = 1:length(U); plot(U{i}(1,:), 'k'); end

% save fig
sgtitle('Tube MPC Approach')
saveas(fig, strcat('figs', filesep, 'pblm2e_results', '.png'));
```



## 2f ----- Result Analysis

Cost

```
J_{100} = [];  
  
for i = 1:100  
    J_{i} = 0;  
    for k = 1:tf-1  
        J_{i} = J_{i} + X_{i}(:,k)'*Q*X_{i}(:,k) + U_{i}(:,k)'*R*U_{i}(:,k);  
    end  
    J_{i} = J_{i} + X_{i}(:,k+1)'*P*X_{i}(:,k+1);  
end  
J = [J_{:}];  
  
J_mean = mean(J)  
J_max = max(J)
```

```
J_mean =  
  
1.4650e+03
```

```
J_max =  
  
1.9730e+03
```

## Local functions

```
function controller = mpc_yalmip_controller(A,B,P,Q,R,N,cons,cons_f) yalmip('clear') nx = size(A,1); nu =  
size(B,2);  
  
u_ = sdpvar(repmat(nu,1,N),ones(1,N));  
x_ = sdpvar(repmat(nx,1,N+1),ones(1,N+1));  
s_ = sdpvar(ones(1,N+1),ones(1,N+1));  
  
constraints = [];  
objective = 0;  
for k = 1:N  
    objective = objective + x_{k}'*Q*x_{k} + u_{k}'*R*u_{k} + s_{k};  
    constraints = [constraints, s_{k} >= 0];  
    constraints = [constraints, x_{k+1} == A*x_{k} + B*u_{k}];  
    constraints = [constraints, cons(x_{k+1},u_{k},s_{k})];  
end  
constraints = [constraints,cons_f(x_{k+1},u_{k},s_{k})];  
objective = objective + x_{k+1}'*P*x_{k+1};  
  
opts = sdpsettings;  
controller = optimizer(constraints,objective,opts,x_{1},u_{1});  
end
```

```
function [X,U,diagnostics_] = run_sim(A,B,V,controller,x0, tf)

    X_{tf+1} = []; U_{tf} = []; diagnostics_{tf} = [];
    X_{1} = x0;
    for k = 1:tf
        [U_{k},diagnostics_{k}] = controller{X_{k}};
        X_{k+1} = A*X_{k} + B*U_{k} + B*V{k};
    end
    X = [X_{:}]; U = [U_{:}];
end

% function fig = plot_trajectory(X, U)
%     fig = figure(...
%         WindowStyle="normal",...
%         Position=[0 0 750 500]);
%     hold on; grid on;
%     subplot(2,1,1);
%     stairs(X')
%     title('State Trajectory')
%     legend({'x_1','x_2'})
%     subplot(2,1,2);
%     stairs(U');
%     title('Input Trajectory')
%     legend({'u_1'})
% end
```

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