

SSY281 Model Predictive Control

Assignment 1

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1 Question 1

1.1 a

Following Lemma2.1, I used *expm* to calculate the A, B, C , then verify the result using *c2d* method.

The code for Q1 is in *homework1_2.mlx*

```
1 disH=expm([A,B;zeros(1,4),0]*h)
2 Adh=disH(1:4,1:4)
3 Bdh=disH(1:4,5)
4
5 %verify
6 sysc=ss(A,B,C,D);
7 sysd=c2d(sysc,h)
```

The result shows:

```
1
2 Adh = ×44
3     1.4421    0.1143         0    -0.0045
4     9.4370    1.4421         0    -0.0908
5     0.0237    0.0008    1.0000    0.0833
6     0.4814    0.0237         0    0.6845
7
8 Bdh = ×41
9     0.0677
10    1.3715
11    0.2530
12    4.7660
13
14 C = ×24
15     1     0     0     0
16     0     0     1     0
17
18 sysd =
19
20 A =
21          x1          x2          x3          x4
22    x1     1.442     0.1143         0    -0.004479
23    x2     9.437     1.442         0    -0.09079
24    x3     0.02375  0.0007924         1    0.08325
```

```

25     x4      0.4814      0.02375      0      0.6845
26
27     B =
28
29         u1
29     x1  0.06765
30     x2   1.371
31     x3   0.253
32     x4   4.766
33
34     C =
35
36         x1  x2  x3  x4
36     y1   1   0   0   0
37     y2   0   0   1   0
38
39     D =
40
41         u1
41     y1   0
42     y2   0

```

1.2 b

Follow the *Lemma2.2*, change the code from question a

```

1  t=0.8*h;
2  disHt=expm([A,B;zeros(1,4),0]*(h-t))
3  Adht=disHt(1:4,1:4)
4  Bdht=disHt(1:4,5)

```

The output is :

```

1  Adht = x44
2      1.0166      0.0201      0      -0.0002
3      1.6627      1.0166      0      -0.0182
4      0.0010      0.0000      1.0000      0.0193
5      0.0968      0.0010      0      0.9272
6
7  Bdht = x41
8      0.0028
9      0.2757
10     0.0111

```

```
11 | 1.1002
```

The eigenvalues of A, A_a shows below:

```
1 ans(A) = ×41
2     1.0000
3     2.4781
4     0.4008
5     0.6899
6
7 ans(A_a) = ×41
8     1.0000
9     1.1990
10    0.8329
11    0.9284
```

We can see the time delay are able to change the eigenvalue of the system, which may change the stability in some situation.

2 Question 2: Dynamic Programming solution of the LQ problem

DPfunctio, *mBatchfunction*, *Dpcon* function are all attached as files.

2.1 a

Set a loop until the system is stable, the criterion is $\lambda(A - B * K) < 1$.

Because in the book equation and in my code, the signs of K are all negative, so in the code I use $+$ instead.

```
1 Na = 33
2 eiga = ×41
3     0.5584
4     0.9236
5     0.9524
6     0.9996
7 Pend = ×44
8 1.0e+04 *
```

```

9
10      3.0780      0.3401      -0.0201      -0.0731
11      0.3401      0.0382      -0.0023      -0.0082
12      -0.0201     -0.0023      0.0042      0.0006
13      -0.0731     -0.0082      0.0006      0.0020
14 Kend =
15
16     -46.1566     -5.2278      0.0155      0.4031

```

2.2 b

Comparing with a, I add the constrain to DP.m shows below:

```

1 if norm(P{i+1}-P{i}) <= 1e-1
2     break;
3 end

```

And the output of *idare* function is:

```

1 P =
2
3     1.0e+04 *
4
5      4.8730      0.5323      -0.1038      -0.1154
6      0.5323      0.0587      -0.0114      -0.0127
7     -0.1038     -0.0114      0.0125      0.0027
8     -0.1154     -0.0127      0.0027      0.0030

```

The output of my DP_{con} is:

```

1 Pcon =
2
3     1.0e+04 *
4
5      4.8726      0.5322      -0.1037      -0.1154
6      0.5322      0.0587      -0.0114      -0.0127
7     -0.1037     -0.0114      0.0125      0.0027
8     -0.1154     -0.0127      0.0027      0.0030
9
10 timecon =
11

```

The iteration times are 426.

2.3 c

Take the P_{con} above into my DP function:

```

1 stable = false;
2 Nc = 0;
3 while ~stable
4     Nc = Nc+1;
5     [Kend1,Pend1] = DP(A,B,Q,R,Pcon,Nc);
6     if all(abs(eig(A+B*Kend1))<=1)
7         stable = true;
8     end
9 end
10 Nc
11 eigc=eig(A+B*Kend1)
12 Pend1
13 Kend1

```

Which says $Nc = 1$ and the $Pend1$ is the same with my $Pcon$.

The result is natural that in section 2b, we already calculate the stationary solution of the Ricatti equation. In this case, no matter N , the result will always be the same, which is equal to the infinite-horizon solution. So just 1 step we reach the solution and no matter how many steps the solution P will always stay the same with P_{con} above.

3 3

mBatch function is attached.

```

1 stable = false;
2 N5 = 0;
3 while ~stable
4     N5 = N5+1;
5     [K0,Pend] = mBatch(A,B,Q,R,Pf,N5);
6     if all(abs(eig(A+B*K0))<=1)
7         stable = true;

```

```

8      end
9  end
10
11 Pf
12 N5
13 eig(A+B*K0)
14 Pend
15 K0

```

And as expected, the result of Batch solution matches exactly with the DP solution.

```

1 N5 =
2
3     33
4
5
6 ans =
7
8     0.5584
9     0.9236
10    0.9524
11    0.9996
12
13
14 Pend =
15
16    1.0e+04 *
17
18     3.0780     0.3401    -0.0201    -0.0731
19     0.3401     0.0382    -0.0023    -0.0082
20    -0.0201    -0.0023     0.0042     0.0006
21    -0.0731    -0.0082     0.0006     0.0020
22
23
24 K0 =
25
26    -46.1566    -5.2278     0.0155     0.4031

```

4 Question 4: Receding horizon control

I achieved RHC using my own mBatch function.

```

1 R4=[1,1,0.1,0.1];
2 N4=[40,80,40,80];
3 Kend=cell(4,1);
4 %using mBatch to solve this
5 for i = 1:4
6     [Kend{i},Pend]=mBatch(A,B,Q,R4(i),Pf,N4(i));
7 end
8
9 Kend
10 T=201;
11 x = cell(4,1);
12 u = cell(4,1);
13 for i = 1:4
14     x{i} = zeros(T, 4);
15     u{i} = zeros(T, 1);
16     x{i}(1, :) = x0;
17     for j = 2:T
18         x{i}(j, :) = (A + B * Kend{i}) * x{i}(j-1, :)' ;
19         u{i}(j) = Kend{i}*x{i}(j-1, :)' ;
20     end
21 end

```

And the plot result shows below:

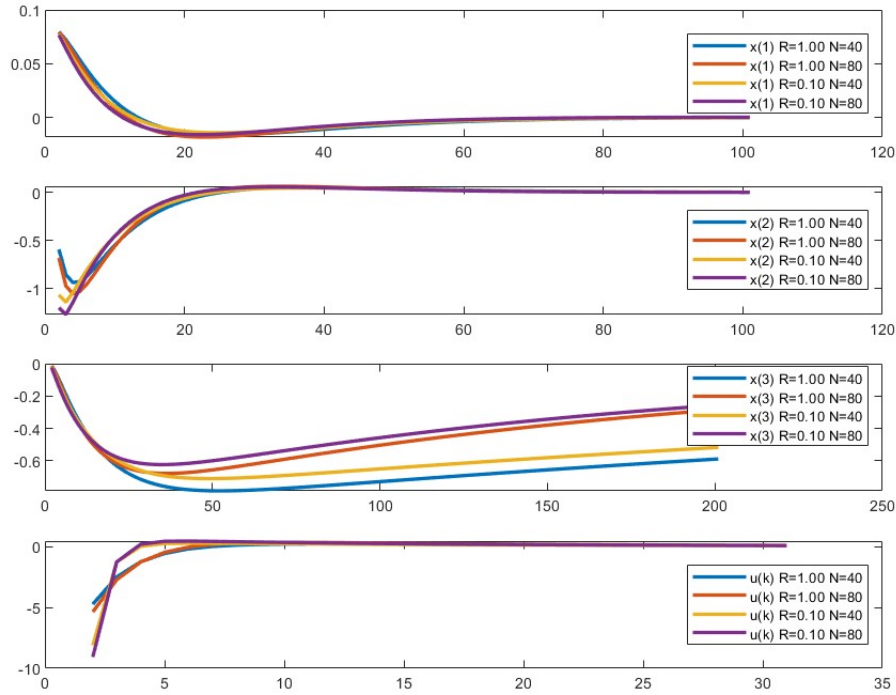


Figure 1: Receding horizon control

The Figure1 is plot without the X_0 U_0 , this remains later in Question 5.

5 Question 5: Constrained receding horizon control

The code for question 5 is in *question5.mlx*. I used CRHC.m from PSS1, and the constraint is changed to this:

```

1 F = kron([eye(N); zeros(N)], [0 1 0 0; 0 -1 0 0; 0 0 0 0; 0 0 0 0]);
2 G = kron([zeros(N); eye(N)], [1; -1; 1; -1]);
3 h = [x2_max*ones(n*N,1); u_max*ones(n*N,1)];

```

And the plot result shows below:

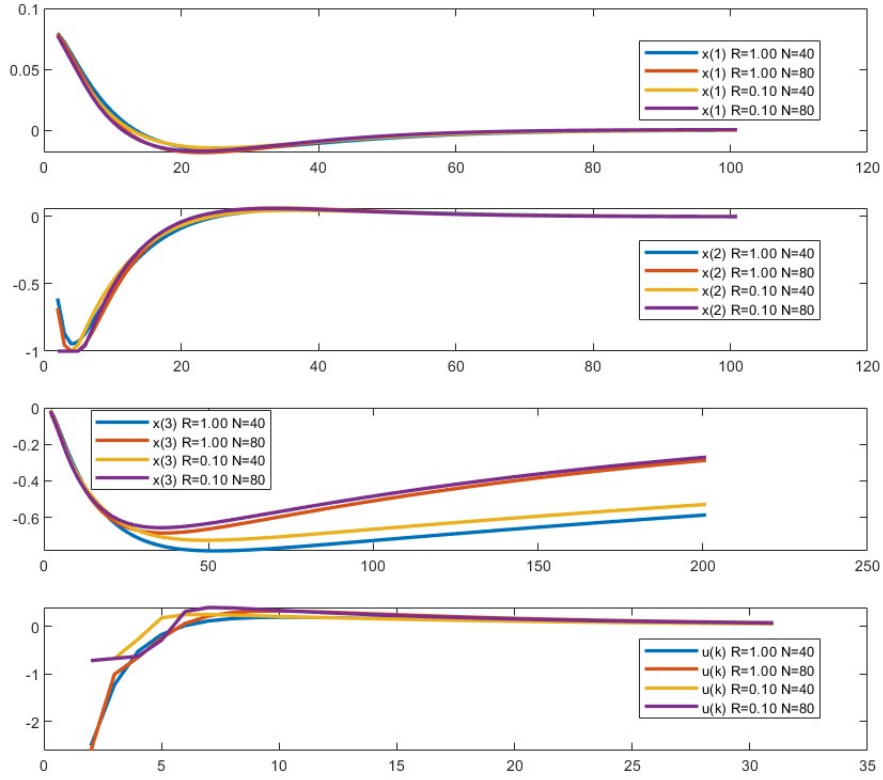


Figure 2: Constraint Receding horizon control

Comparing the Figure2 and Figure1, we can find the main difference is at the control signal u . Because the constraint exist that the u need to consider the range.

This appears apparently when $R=0.1$, which means u is kind of cheap. In unconstraint situation, we can see control signal u goes high while in the constraint situation control signal u runs more cautious.