



**THE UNIVERSITY OF TEXAS AT ARLINGTON, TEXAS  
DEPARTMENT OF ELECTRICAL ENGINEERING**

**EE 5327 - 001**

**SYSTEM IDENTIFICATION & ESTIMATION**

**Project #1  
EXAM**

**by**

**SOUTRIK MAITI**

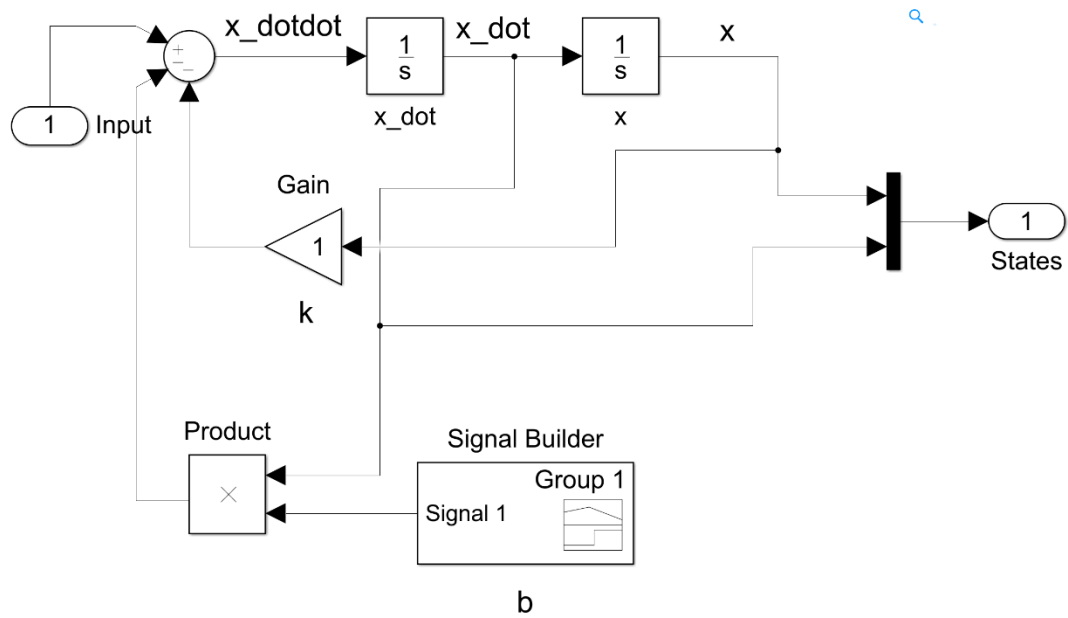
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**Presented to**

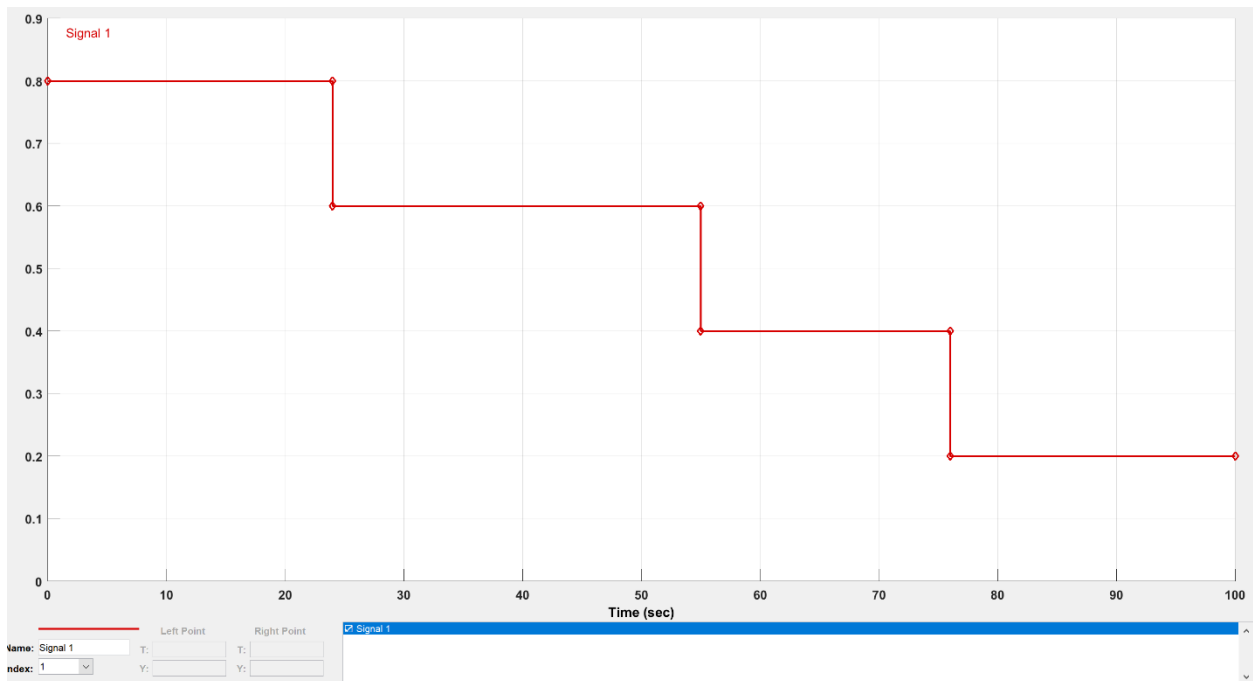
**Prof. Michael Niestroy**

**Oct 25th, 2017**

## 1) Implementing the 2<sup>nd</sup> order differential equation



A signal generator is used to give the system, the values of  $b$  at different time.



*The block parameters of the square wave used as an input to the system.*

Block Parameters: Signal Generator

Signal Generator

Output various wave forms:  
 $Y(t) = \text{Amp} * \text{Waveform}(\text{Freq}, t)$

Parameters

Wave form: square

Time (t): Use simulation time

Amplitude: 1

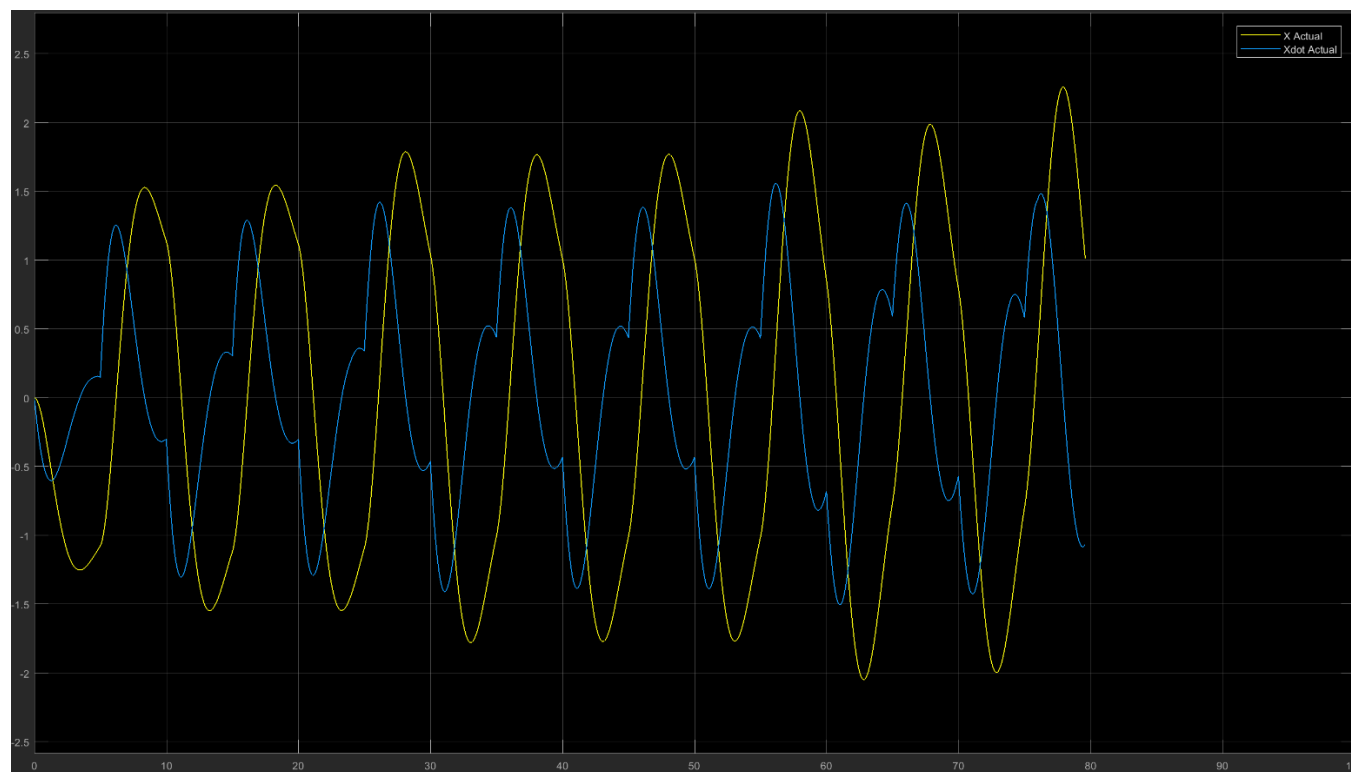
Frequency: 0.1

Units: Hertz

☒ Interpret vector parameters as 1-D

OK Cancel Help Apply

*Output of the plant – The actual states of the system*



2) Noisy output after adding random noise to the output.

The noise added have the following properties :

Block Parameters: Random Number1

Random Number

Output a normally (Gaussian) distributed random signal. Output is repeatable for a given seed.

Parameters

Mean: 0

Variance: 0.001

Seed: 67

Sample time: 0.01

☒ Interpret vector parameters as 1-D

Block Parameters: Random Number

Random Number

Output a normally (Gaussian) distributed random signal. Output is repeatable for a given seed.

Parameters

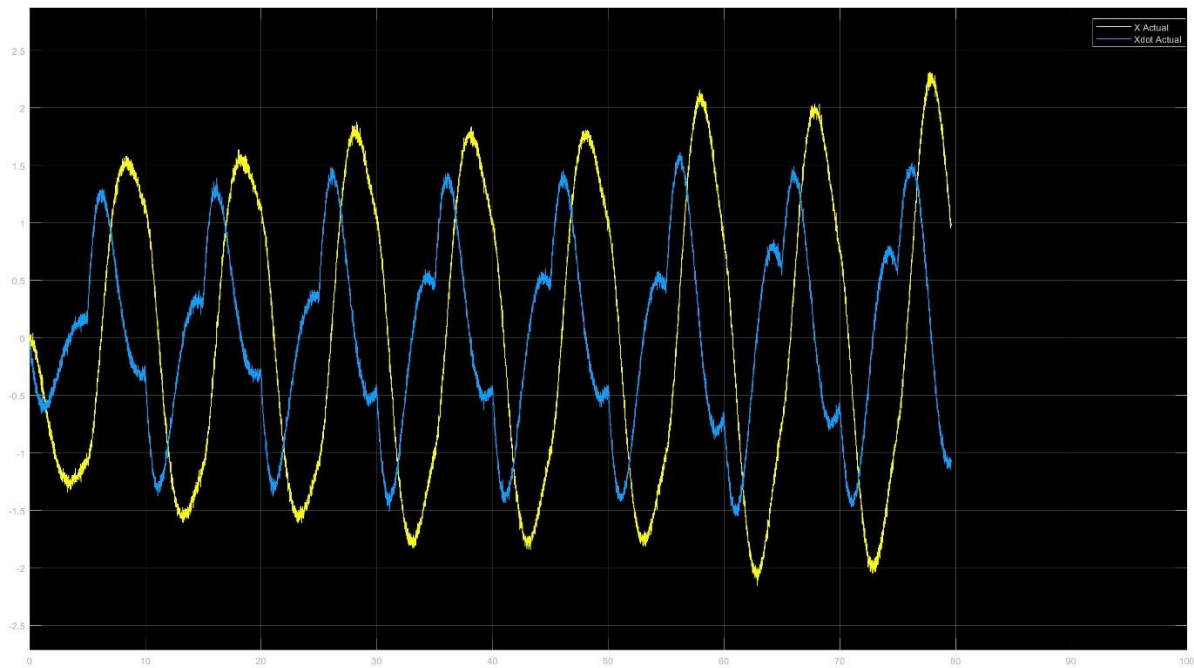
Mean: 0

Variance: 0.001

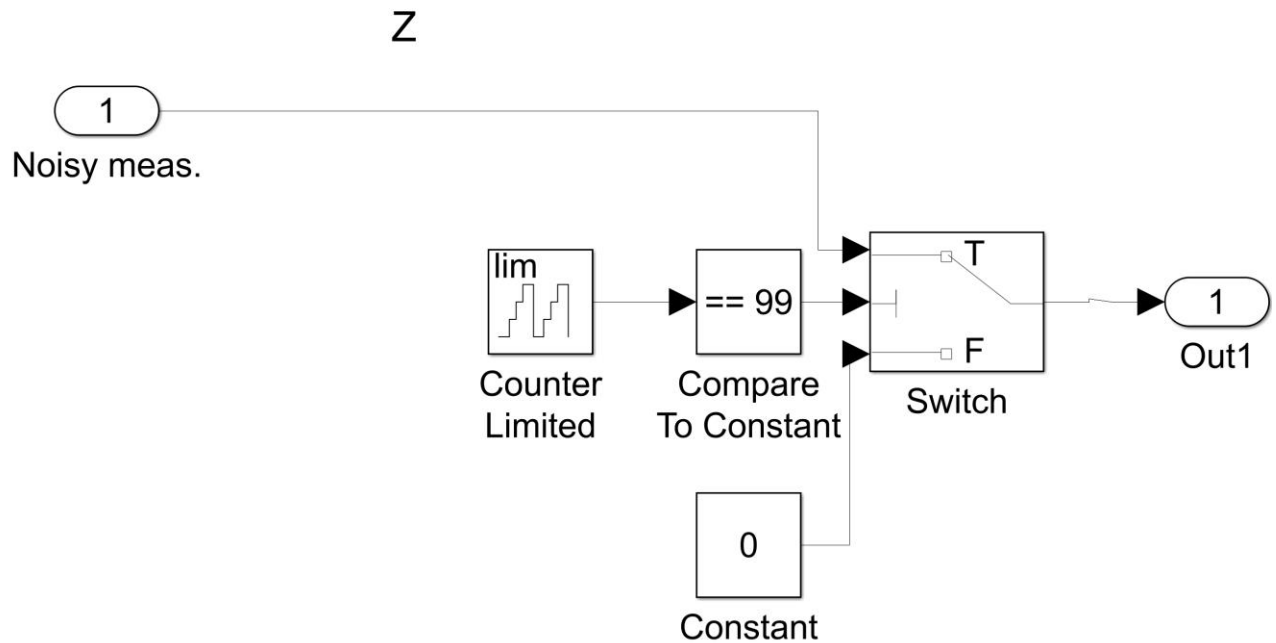
Seed: 47

Sample time: 0.01

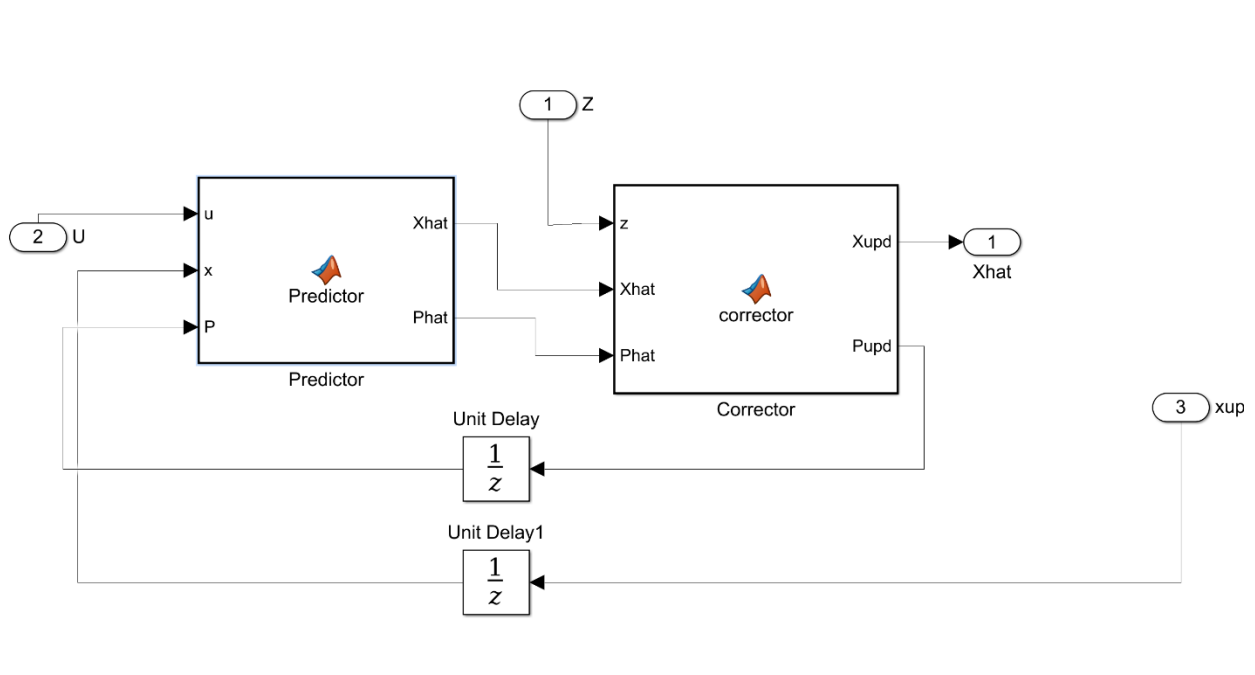
☒ Interpret vector parameters as 1-D



*The use of limited counter lets the Kalman filter run at 1Hz.*



3) The following shows figure shows a single Kalman filter bank.



MATLAB Code for the Kalman filter (where  $b=0.8$ ) :-

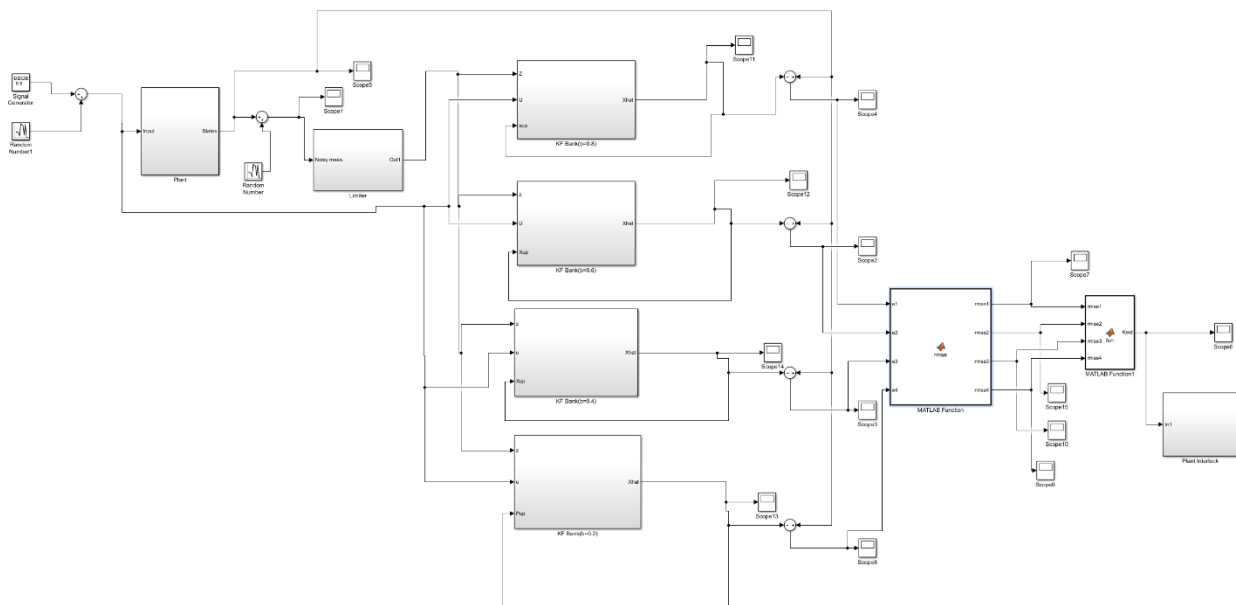
### Predictor block

```
function [Xhat,Phat] = Predictor(u,x,P)
Q=10*eye(2);b =[0; 1];
a=[0 1;-1 -.8]; %[0 1;-k -b]
ad=expm(a*0.01);
bd=inv(a)*(ad-eye(2))*b;
f=[-a Q;
    zeros(2,2) a'];
g=expm(f*0.01);
Qd=g(3:4,3:4)'*g(1:2,3:4);
Xhat=ad*x+bd*u; %State prediction
Phat=ad*P+ad'*Qd; %Covariance prediction
End
```

### Corrector block

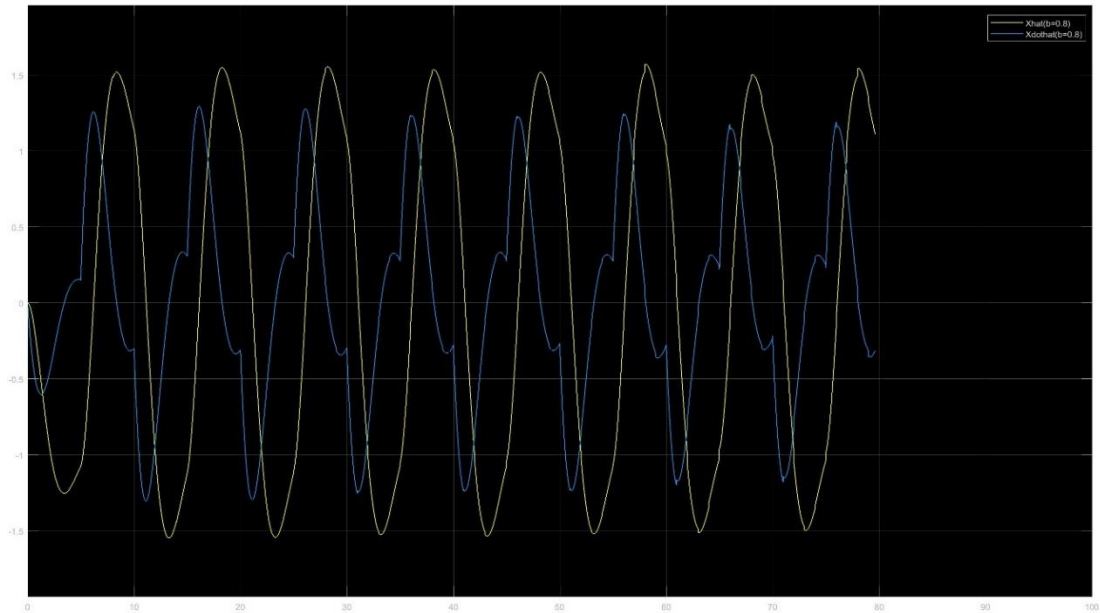
```
function [Xupd,Pupd] = corrector(z,Xhat,Phat)
h=eye(2);
r=eye(2);
if z(1) == 0 && z(2) == 0
    Xupd = Xhat;
    Pupd = Phat;
else
    rd= 1 /0.01 * r;
    K=Phat*h'*inv(h*Phat*h'+rd);
    Pupd=(eye(2)-K*h)*Phat*(eye(2)-K*h)'+K*rd*K';
    Xupd=Xhat+K*(z-h*Xhat);
end
end
```

### Block diagram of the entire plant

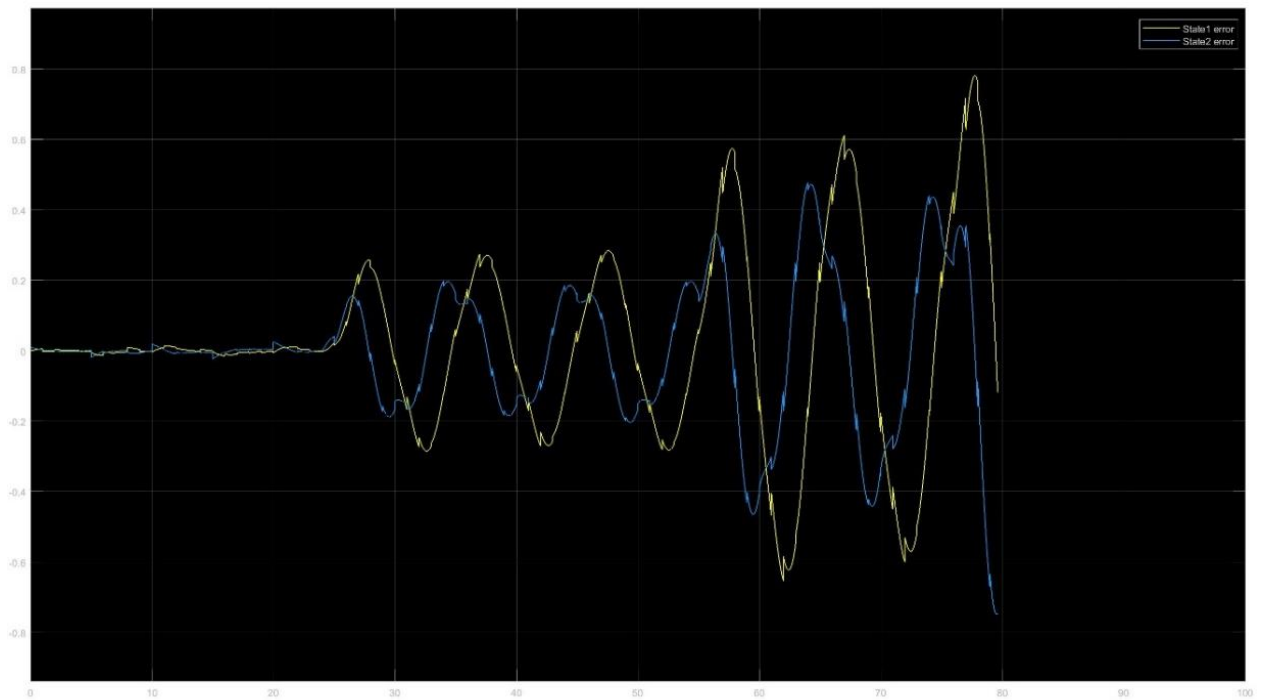


The values of Q and R selected are:  $Q=10 \cdot \text{eye}(2)$ ,  $R= \text{eye}(2)$ .

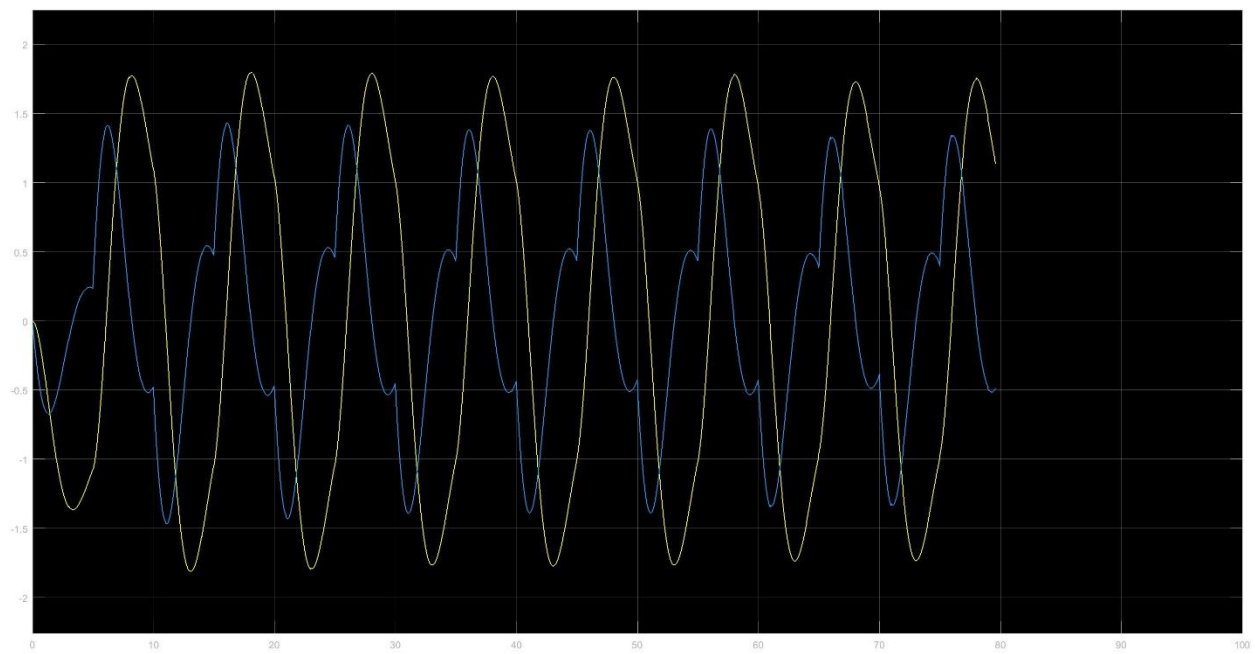
$b=0.8$



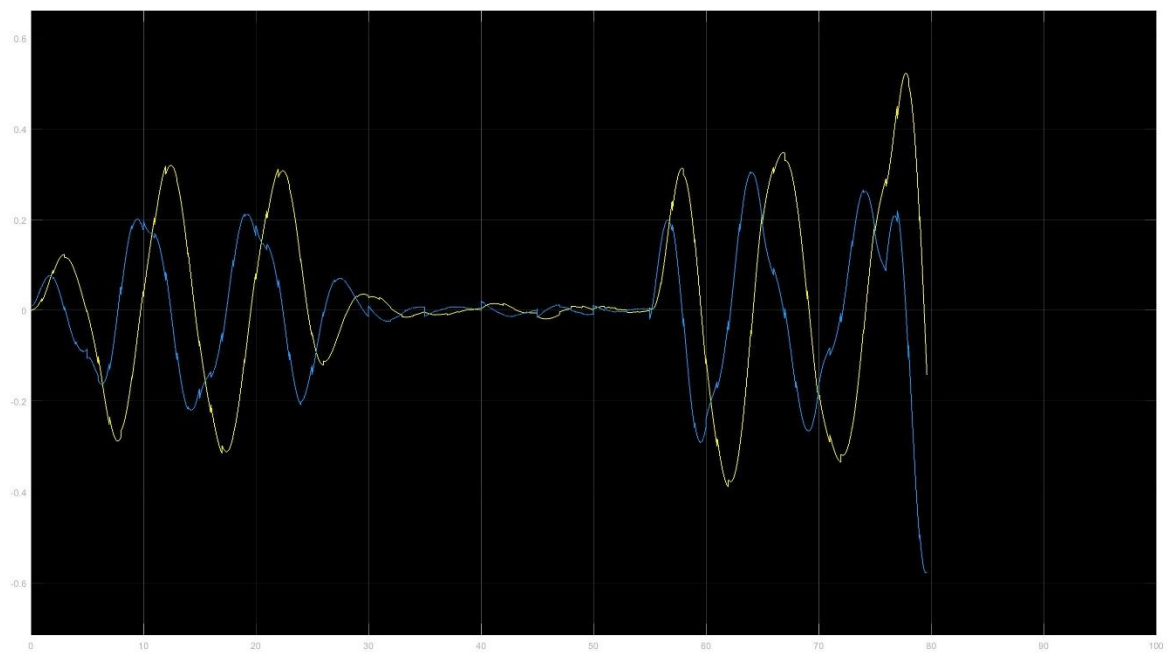
Error ( $b=0.8$ )



**b=0.6**

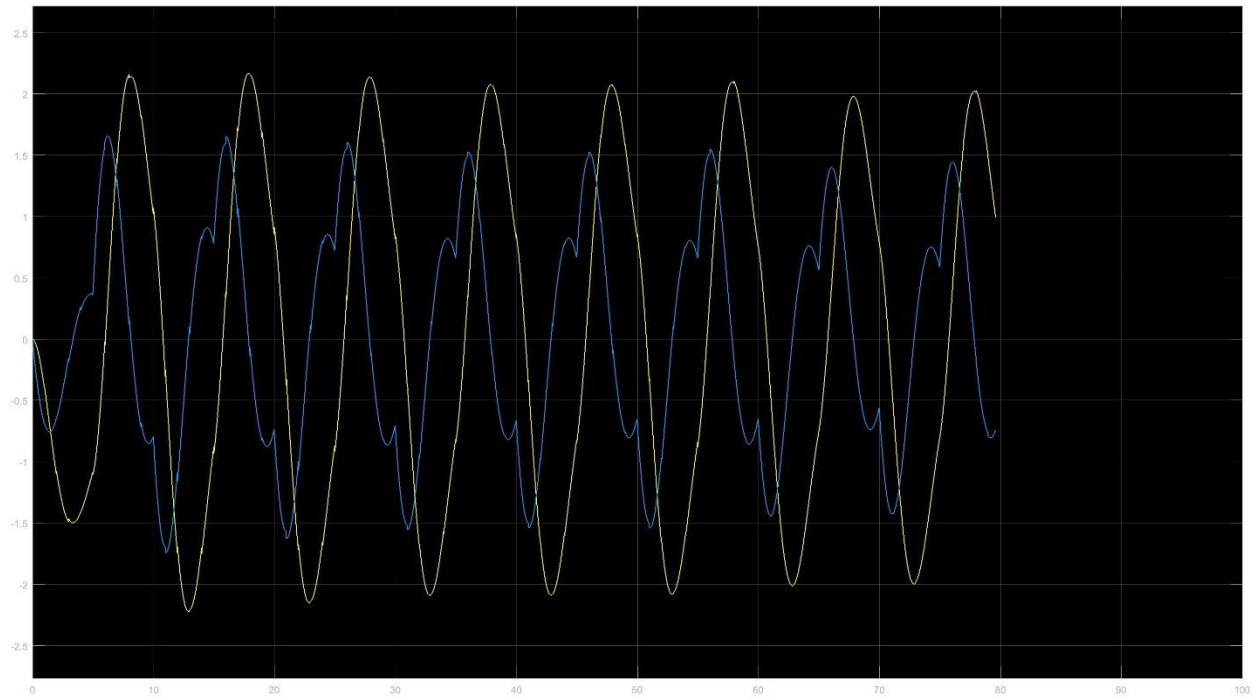


**Error (b=0.6)**

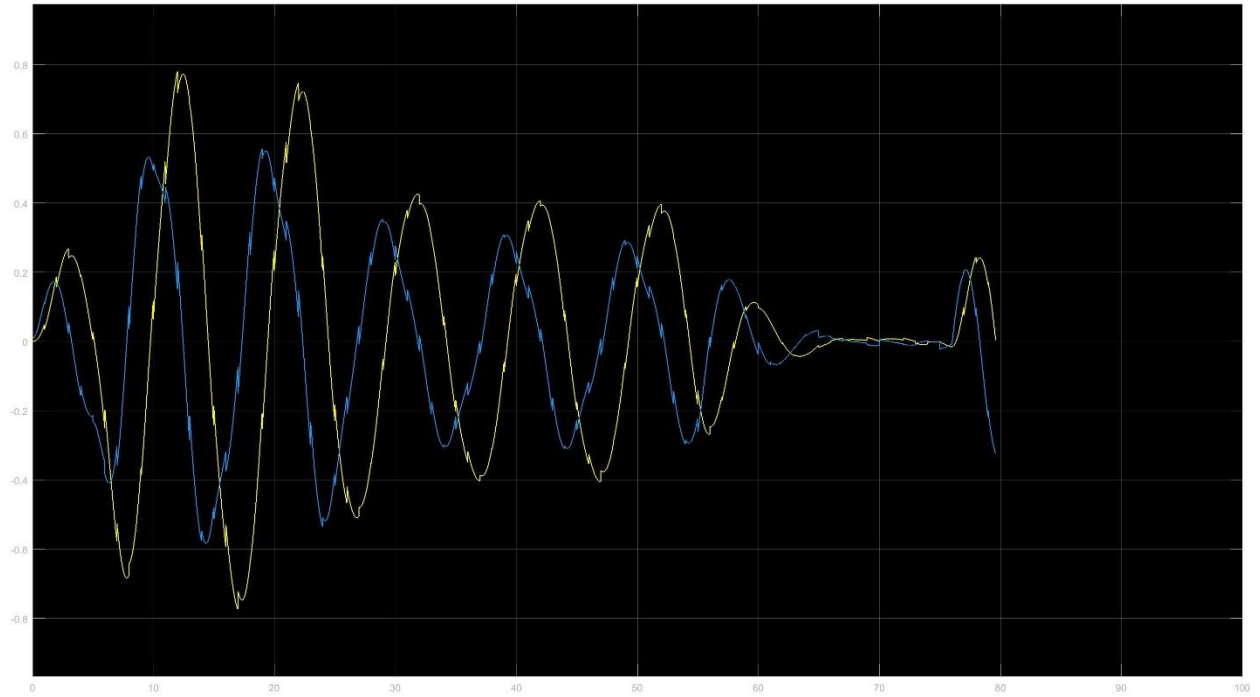




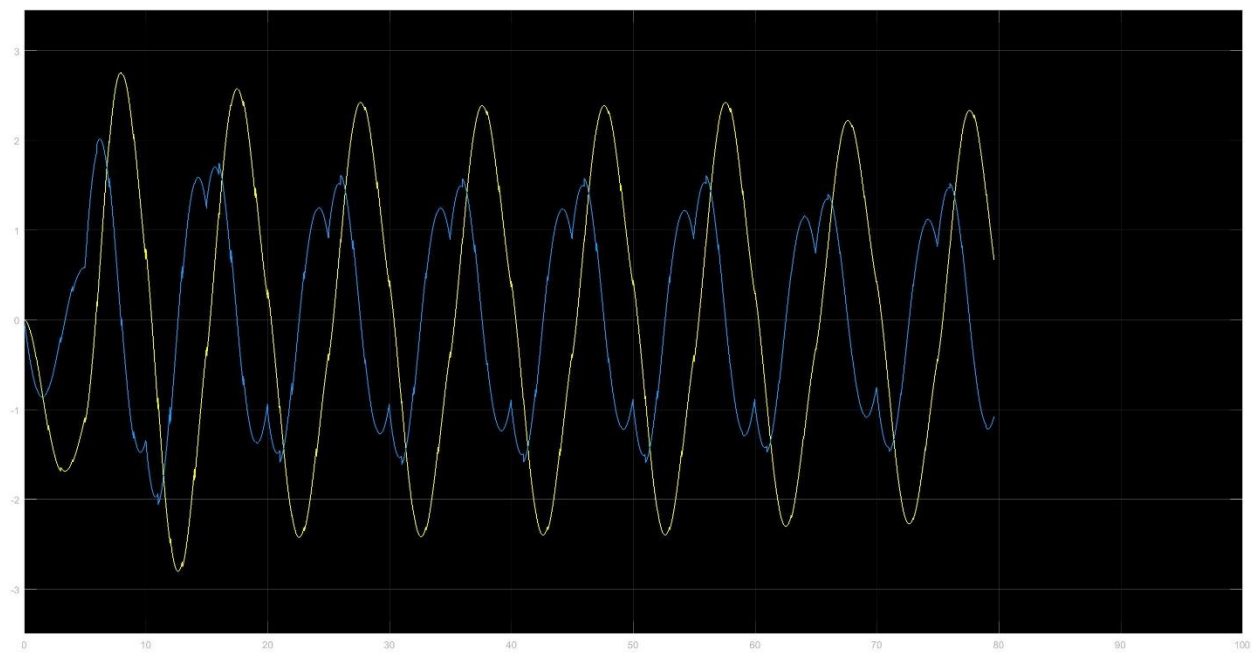
**b = 0.4**



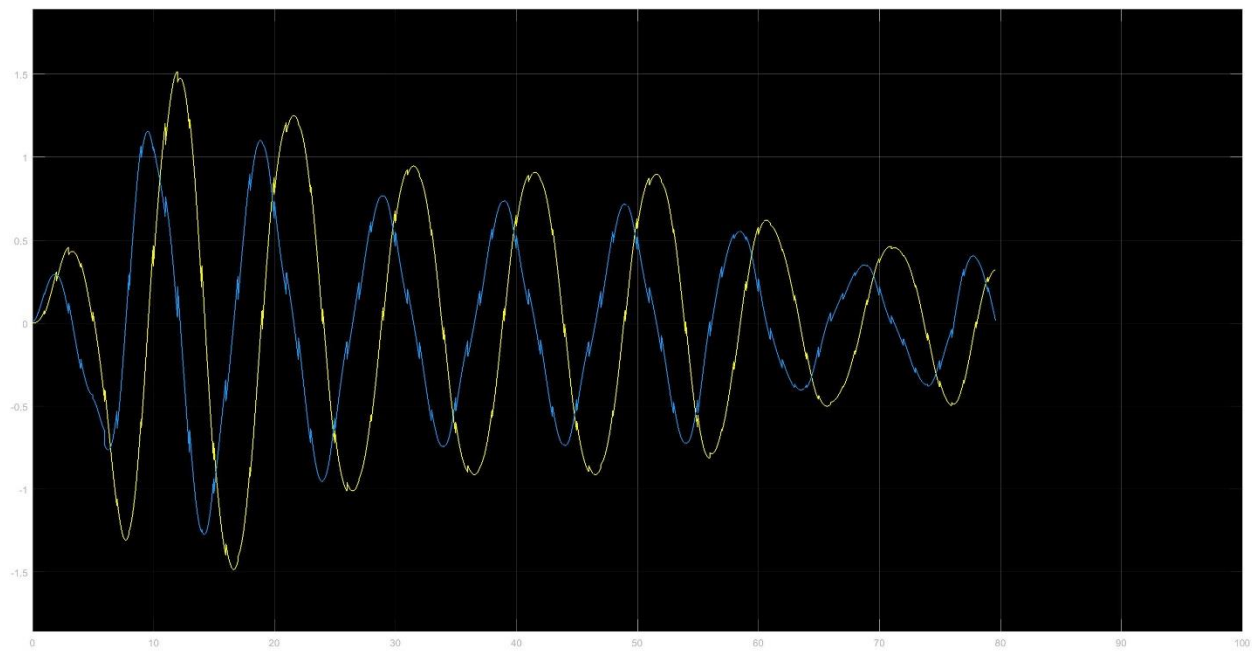
**Error (b=0.4)**



**b = 0.2**



**Error (b=0.2)**



- 4) To normalize the error, we take the RMSE of the errors and observe the different plots for different values of  $b$ .

The MATLAB code for RMSE calculation is as follows :

```
function [rmse1,rmse2,rmse3,rmse4] = rmse(e1,e2,e3,e4)

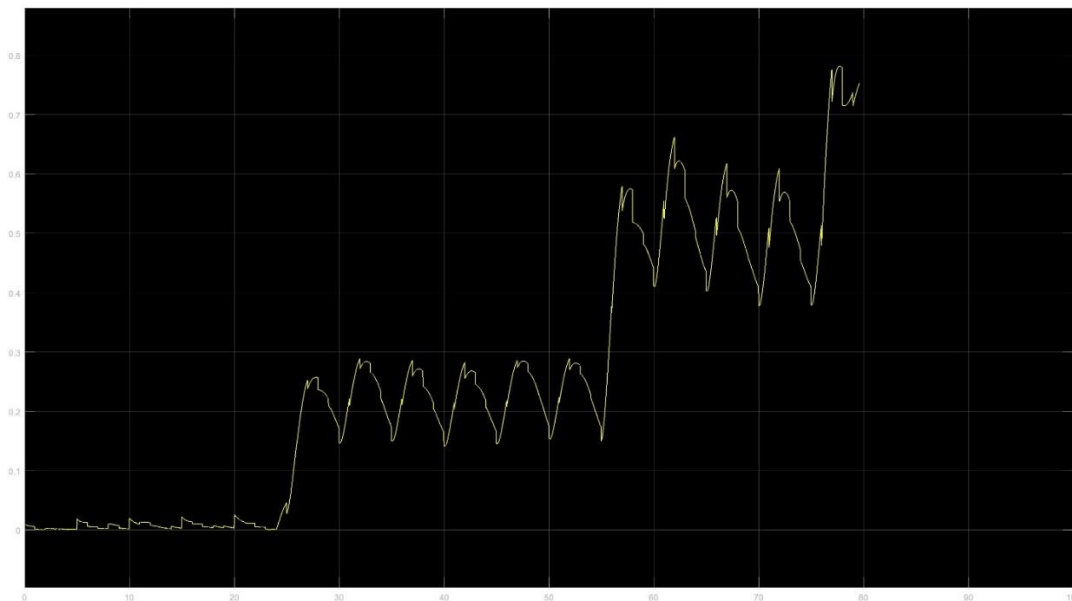
rmse1=sqrt(e1(1)^2+e1(2)^2);
rmse2=sqrt(e2(1)^2+e2(2)^2);
rmse3=sqrt(e3(1)^2+e3(2)^2);
rmse4=sqrt(e4(1)^2+e4(2)^2);
end
```

The MATLAB code for K estimates is as follows :

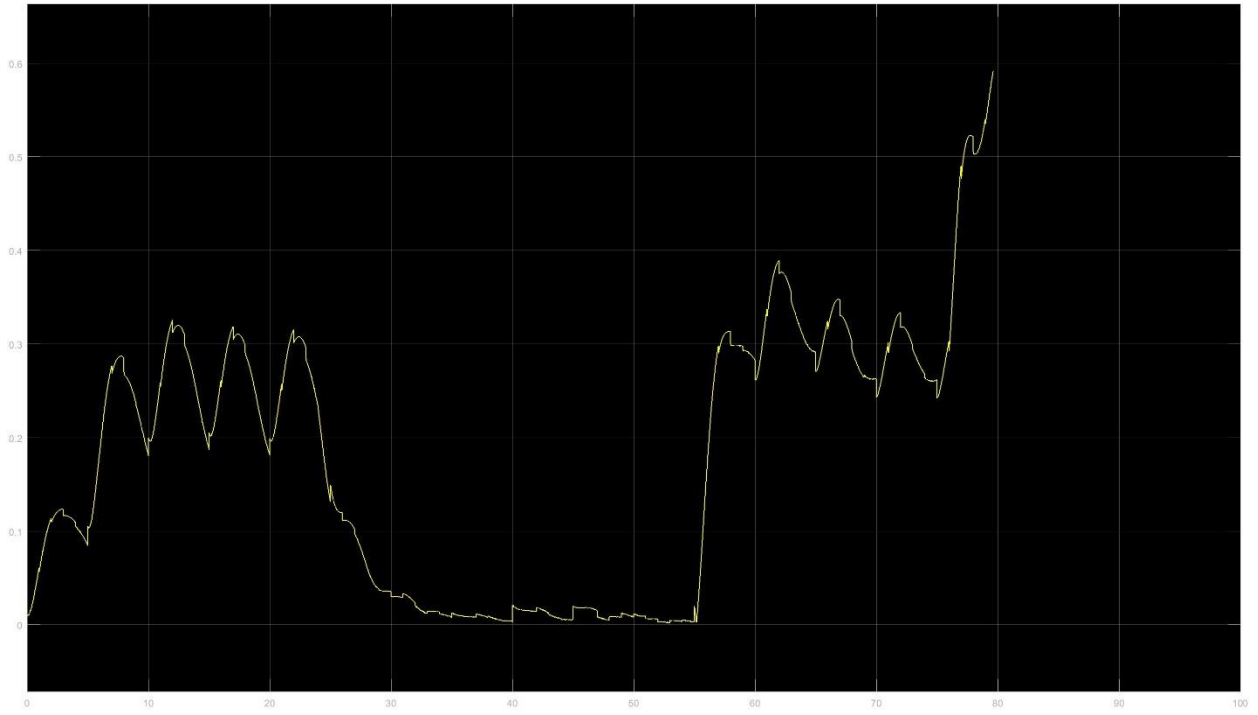
```
function Kest = fcn(rmse1,rmse2,rmse3,rmse4)

[j,k]=min([rmse1,rmse2,rmse3,rmse4]);
Kest=.8;
switch k
    case 1
        Kest=.8;
    case 2
        Kest=0.6;
    case 3
        Kest=0.4;
    case 4
        Kest=0.2;
end
end
```

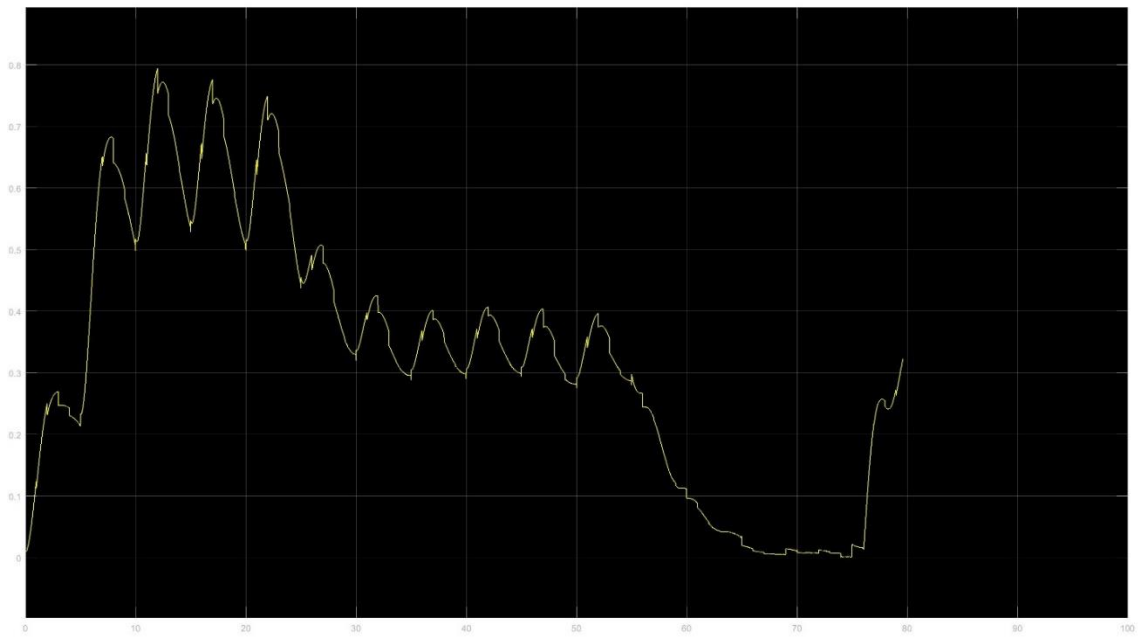
For  $b = 0.8$



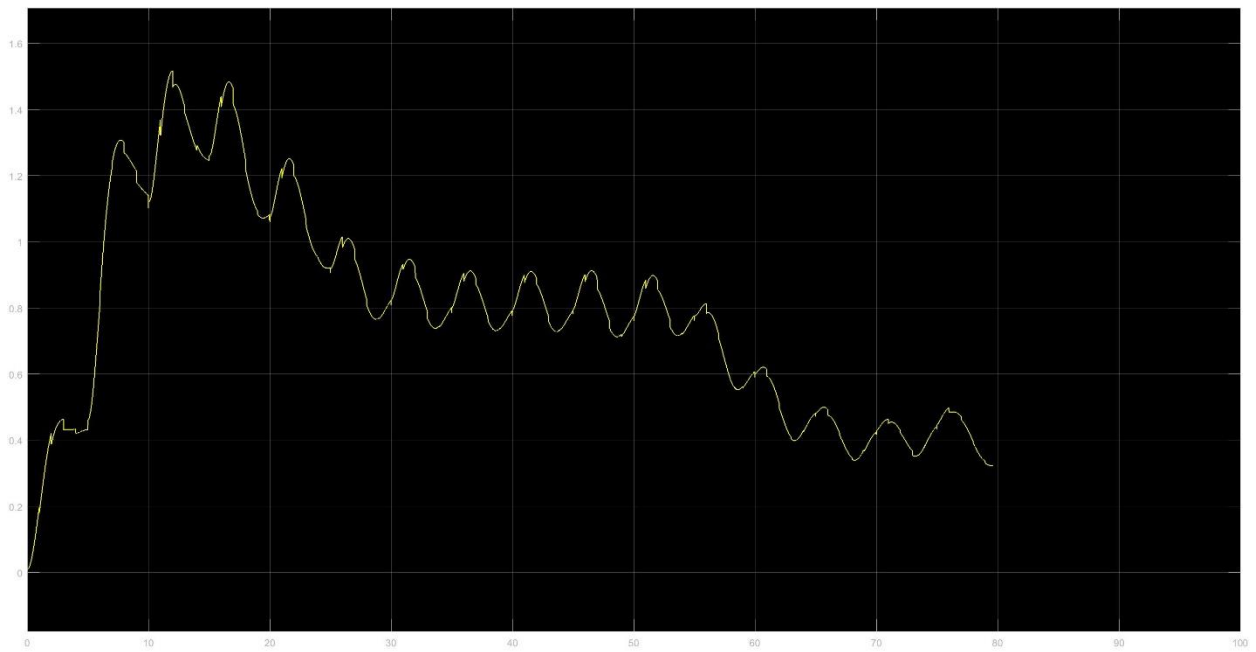
**b = 0.6**



**b = 0.4**



$b = 0.2$



From the above plots, at  $b = 0.6$ , the error is minimum for a longer time. This means that the filter performs optimally when  $b=0.6$ . Therefore select the Kalman filter with  $b=0.6$ .

The following figure shows that the system continues to work till 79s although the third failure occurred at around 76s. It took 3s for the system to stop.

