

a)

`[B,A] = butter(N,Wn)`

where N means Nth order lowpass digital Butterworth filter, and Wn means the cutoff frequency.

In this question, we use second order Butterworth filter, so  $N = 2$ .

Sampling frequency is 100Hz, and cutoff frequency is 5Hz, so  $Wn = 5/(100/5) = 0.1$ .

Thus, `[B,A] = butter(2, 0.1)`

```
>>
>>
>> [B,A] = butter(2, 0.1)

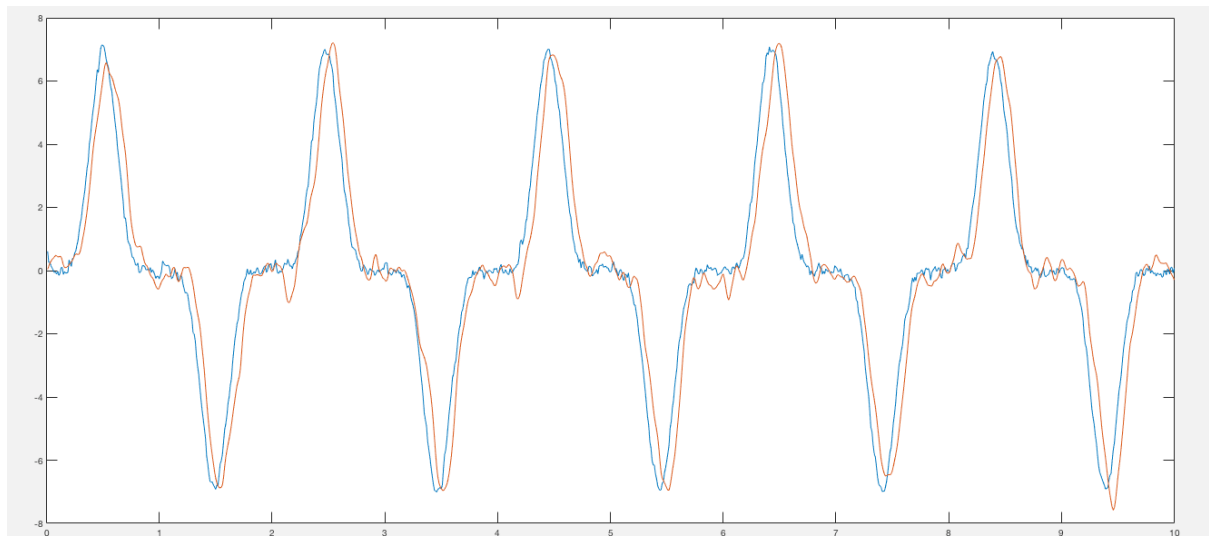
B =
    0.0201    0.0402    0.0201

A =
    1.0000   -1.5610    0.6414
```

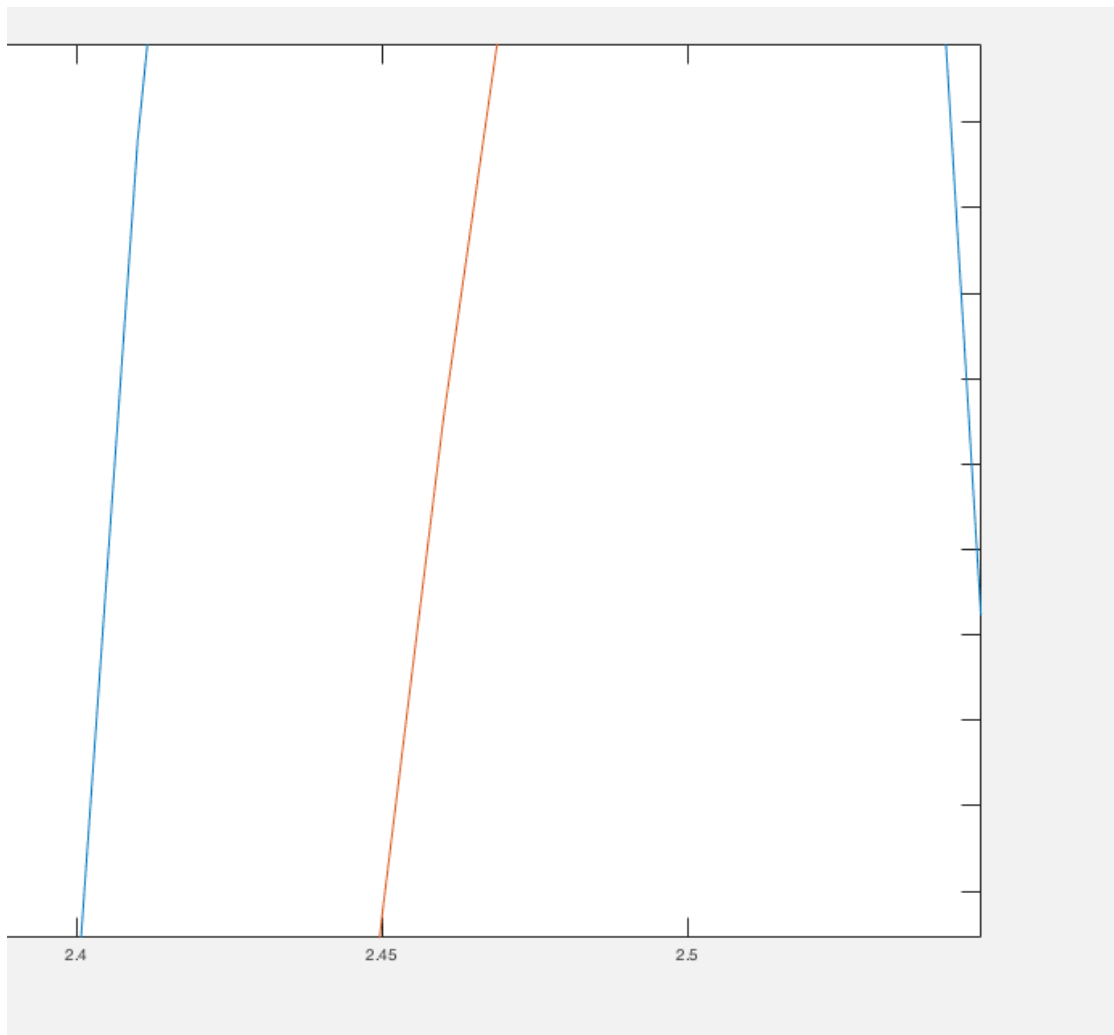
$b_1 = 0.0201$   $b_2 = 0.0402$   $b_3 = 0.0201$   $a_2 = -1.5610$   $a_3 = 0.6414$

b)

```
1 - input = importdata('noisy.data');
2 - Y = input(:, 1);
3 - X = input(:, 2);
4 - [B,A] = butter(2, 0.1);
5 - YY = filter(B, A, Y);
6 - time=0.01:0.01:10;
7 - res = [X YY];
8 - delay = finddelay(X, YY) * 0.01
9 - figure
10 - plot(0.01:0.01:10, res)
11
12
```



The filter works pretty well, basically get the value we want, but has some delay, and shake a lot more when position near 0.



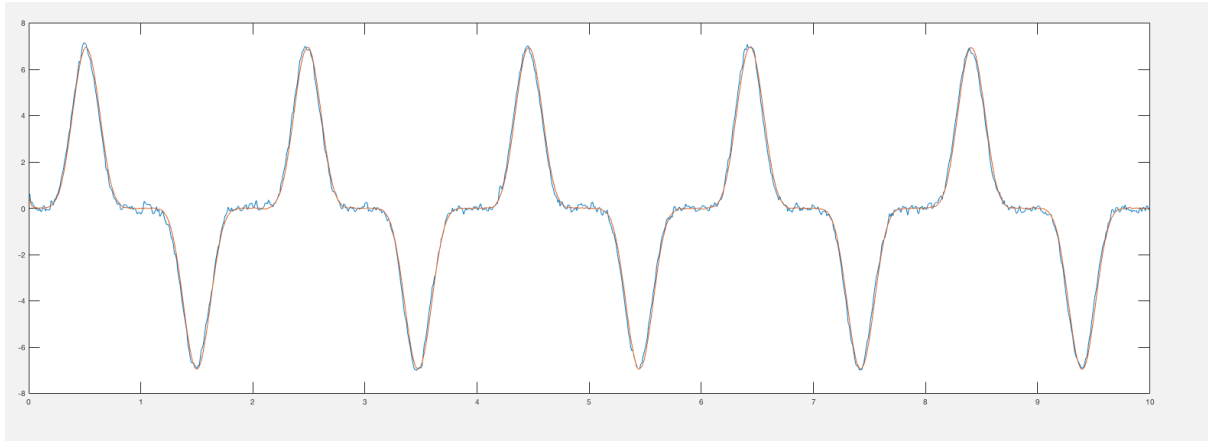
When we zoom in the plot, we can find the delay is about 0.05.

```
>> hw3b  
  
delay =  
  
    0.0500
```

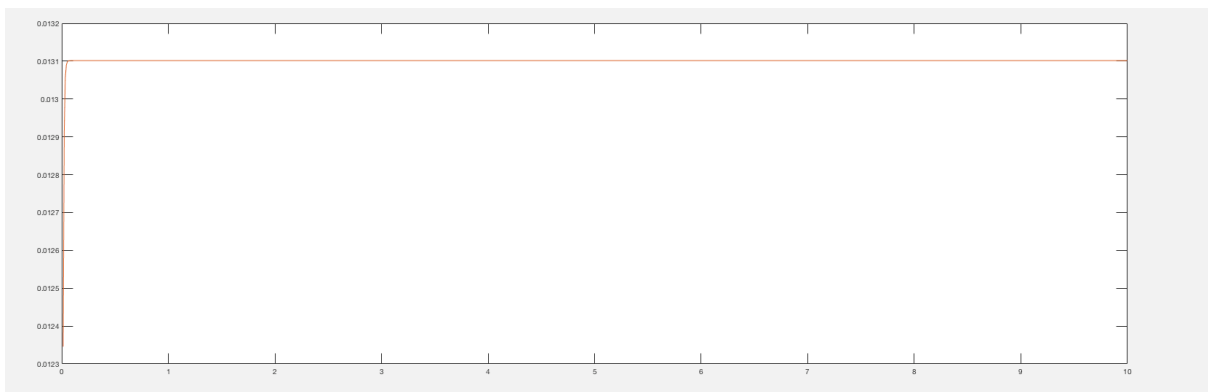
Besides from the plot, we can also get delay from script by “finddelay” function. In conclusion, delay is 0.05

c)

```
1 - input = importdata('noisy.data');
2 - Y = input(:, 1);
3 - X = input(:, 2);
4 - U = input(:, 3);
5 - len = length(X);
6
7 - p = 0.01;
8 - a = 0.5;
9 - b = 3.5;
10 - q = 0.01;
11 - r = 1.0;
12 - c = 1;
13 - x_hat = 0;
14 - x_tilde = 0;
15 - K = [];
16 - P = [];
17 - X_Hat = [];
18 - i = 1;
19 - while i <= len
20 -     p_tilde = a * p * a + q;
21 -     k = (p_tilde * c) / (c * p_tilde * c + r);
22 -     K = [K ; k];
23 -     x_hat = x_tilde + k * (Y(i) - c * x_tilde);
24 -     X_Hat = [X_Hat ; x_hat];
25 -     p = (1 - k * c) * p_tilde;
26 -     P = [P ; p];
27 -     x_tilde = a * x_hat + b * U(i);
28 -     i = i + 1;
29 - end
30 - delay = finddelay(X, X_Hat) * 0.01
31 - figure
32 - plot(0.01:0.01:10, [X X_Hat])
33 - figure
34 - plot(0.01:0.01:10, [K P])
35
```



*Graph for  $x^n$  and  $\hat{x}^n$*

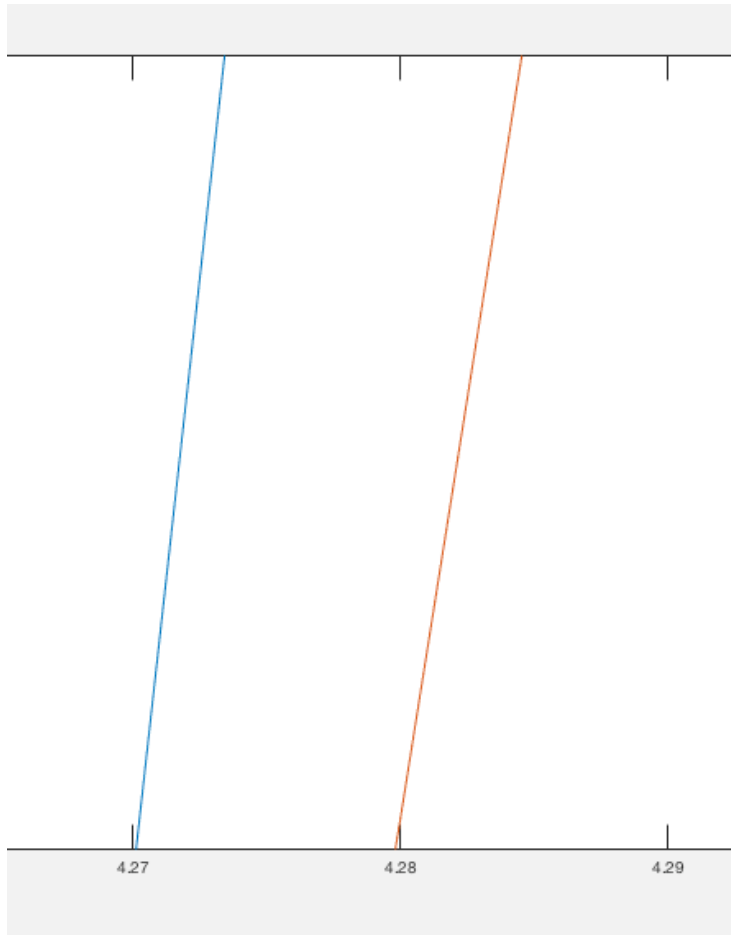


*Graph for  $K$  and  $P$*

This filter works awesome, and much better than Butterworth filter. The line is almost coincident with line for  $X$ . This filter has less delay than Butterworth, and more smooth than Butterworth when position near 0. The line of this filter is even smooth than line for  $X$ .

$$P = E\{e^n e^{nT}\}, \text{ and } e^n = x^n - \hat{x}^n$$

Because we already know  $\varepsilon_x \sim N(0, \sigma_x^2)$ , and  $\sigma_x^2 = 0.01$ , so we initialize  $p_0 = 0.01$ .



When we zoom in the plot, we can find the delay is about 0.01.

```
>> hw3c  
delay =  
    0.0100
```

Besides from the plot, we can also get delay from script by “finddelay” function. In conclusion, delay is 0.01.