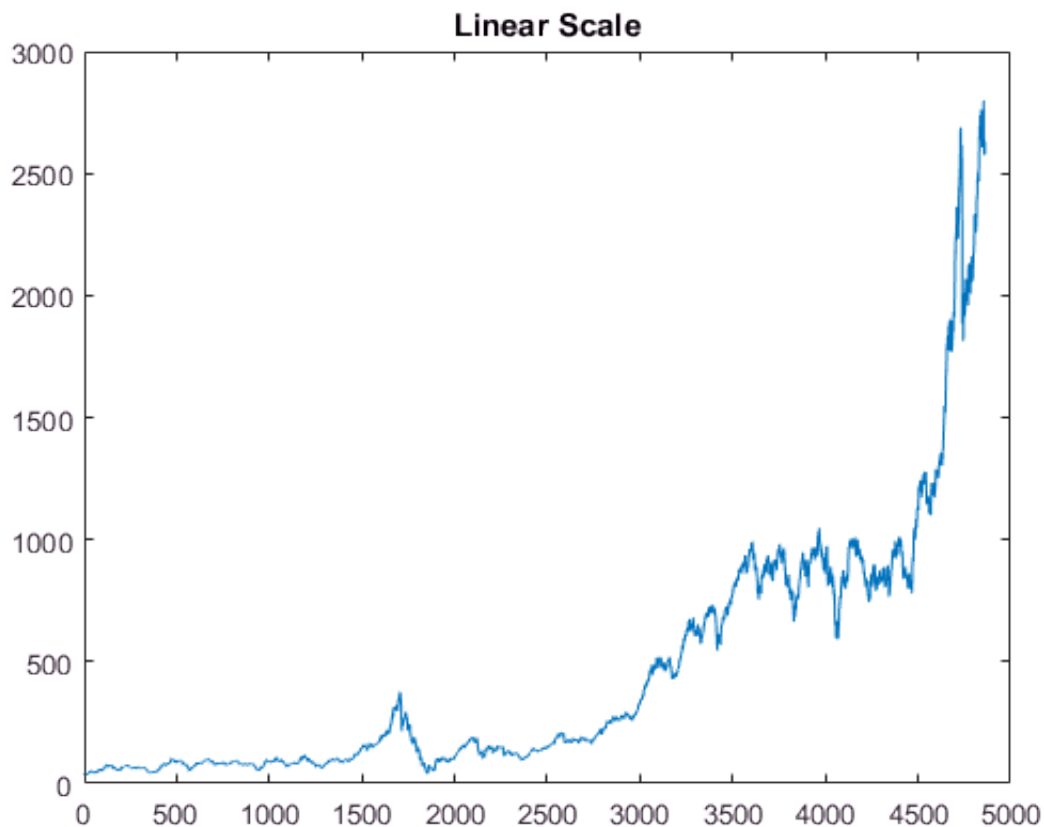


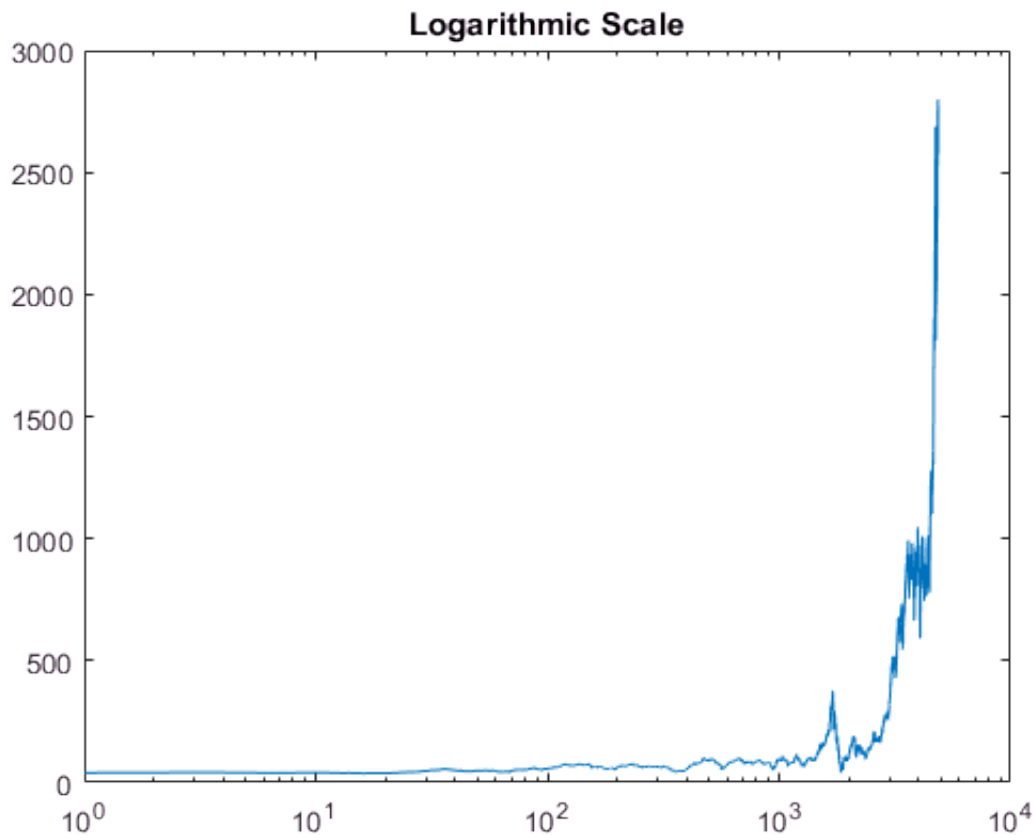
(a) Plot the DJIA data on both a linear and a semi-logarithmic scale. Assuming that you started with \$1000 and invested all of your money in the DJIA, how much money would you have at the end of the investment interval (4861 weeks)? If you had put all of your money in the bank at 3% annual percentage rate (APR), compounded weekly,

what rate would you need to achieve the same level of performance? If $r = 0.03$ is the APR, then the bank balance after N weeks from a weekly compounded interest bearing account is equal to $g = (1 + \frac{r}{52})^N$ the initial balance.

```
load djia.mat
%RNG to pick different risk tolerance
rng_num = randi(2);
risk_percent = [1, 0.50];
risk = risk_percent * 1000;
%la
figure;
plot(djia)
title('Linear Scale')
```



```
semilogx(djia)
title('Logarithmic Scale')
```



```

if (rng_num == 1)
    djia_investment_rate = djia(end)/djia(1);
    djia_investment = 1000*djia_investment_rate;
    txt1 = ['The investment of $1000 into DJIA will yeild ', num2str(djia_investment)];
    disp(txt1);
else
    djia_investment_rate = djia(end)/djia(1);
    djia_investment = 500*djia_investment_rate;
    txt1 = ['The investment of $500 into DJIA will yeild ', num2str(djia_investment)];
    disp(txt1);
end

```

The investment of \$1000 into DJIA will yeild 64394.9045

```

%Investing in the bank
N = 4861;
if (rng_num == 1)
    bank_interest = (1 +0.03/52)^N;
    bank_investment = 1000 + (1000 * bank_interest);
    txt1_2 = ['The investment of $1000 into DJIA will yeild ', num2str(bank_investment)];
    disp(txt1_2);
else
    bank_interest = (1 +0.03/52)^N;
    bank_investment = 500 + (200 * bank_interest);
    txt1_2 = ['The investment of $500 into DJIA will yeild ', num2str(bank_investment)];
    disp(txt1_2);
end

```

The investment of \$1000 into DJIA will yeild 17504.1922

```
% To find r, the profit rate
N = length(djia);
r = ((djia_investment_rate)^(1/N)-1)*52;
txt2 = ['To have the same yeild as investing in DJIA, we will need a rate of ',num2str(r*100),
disp(txt2)
```

To have the same yeild as investing in DJIA, we will need a rate of 4.4574%

(b) Assume that $p = 3$ and create the vector x and matrix X in Eq. (6.29) from the first decade of data, i.e., use $N = 520$ weeks. The MATLAB `\` operator can be used to solve for the vector a that minimizes the inner product $e^T J^T e$ in Eq. (6.29). Solve for the linear predictor coefficients using the MATLAB `\` operator by $a = -X \backslash x$.

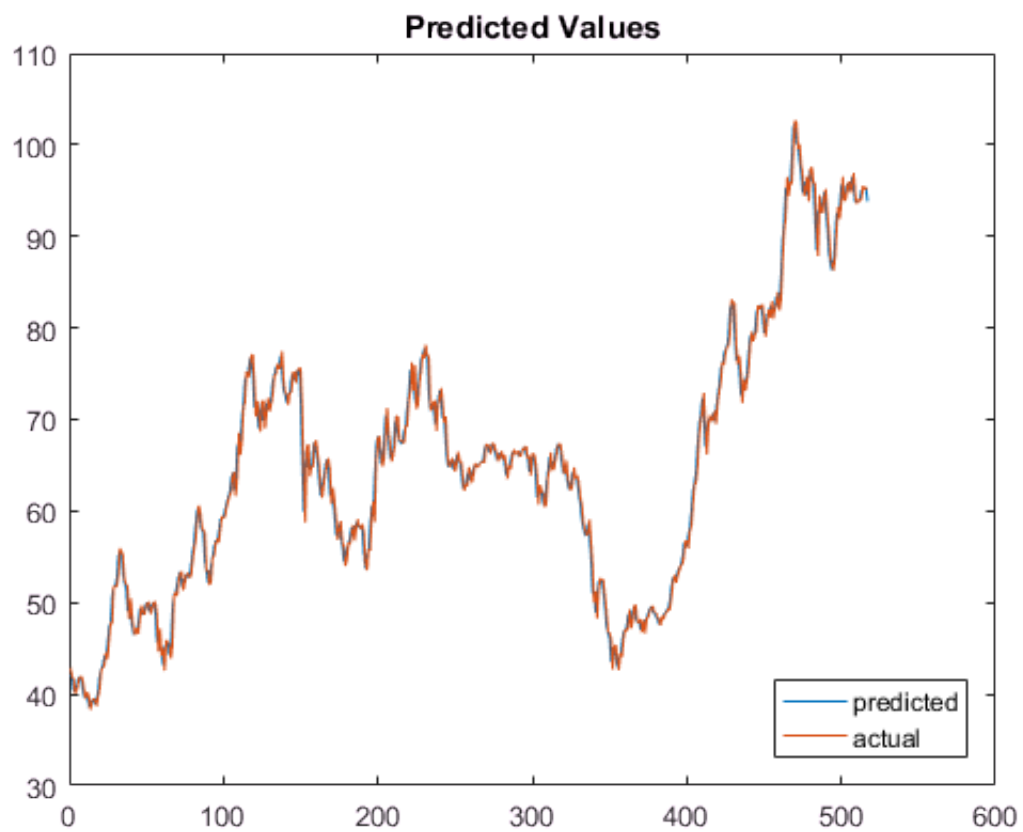
```
%1b
p = 3;
NN = 520;

% Defining X
for i = 1:NN-p
    for j = 1:p
        X(i,j) = djia(i+j-1);
    end
end

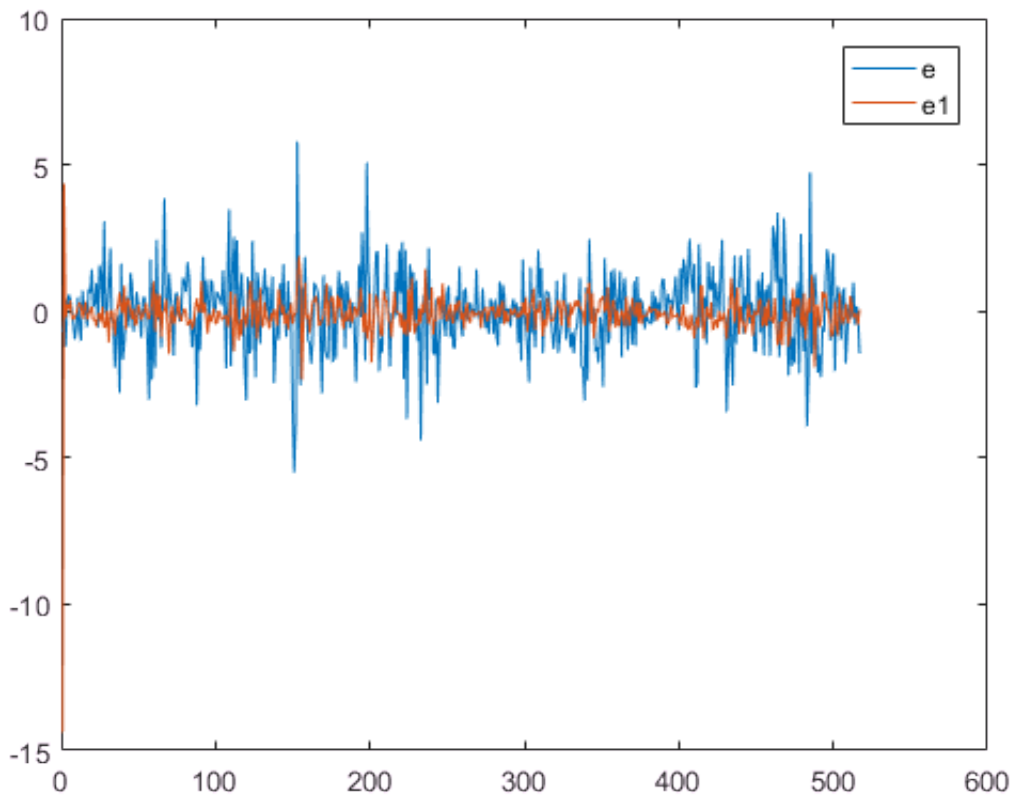
% Defining x
for i = p+1:NN
    x(i-p,1) = djia(i);
end
% Solve for coefficients using X and x
a = -X \ x;
```

(c) Create the vector of predicted values for the first decade of data using $\hat{x} = -X^T a$. Also create the vector $\hat{x}2$ by appropriately using `filter` on the sequence `djia`. Note that the coefficients in the vector a are in the reverse of the order required by `filter`. Plot the predicted values on the same set of axes as the actual weekly average. Also determine the total squared error between the predicted and actual values. As a check, do this two ways. First use $e = x + X^T a$ to compute the prediction error, and L1 then calculate the error by subtracting your predicted sequence $\hat{x}2$ from the actual values and make sure that these are the same.

```
%1c
xhat1 = -X*a;
xhat2 = filter(-flip(a),1,djia(1:NN-p));
figure
plot(djia(4:520))
hold on
plot(xhat1)
legend('predicted','actual','location','southeast')
title('Predicted Values')
hold off
```



```
% Total squared error  
e = x+X*a; % prediction error  
e1 = djia(1:517)-xhat2;  
figure  
plot(e)  
hold on  
plot(e1)  
legend('e','e1')
```



(d) Calculate and plot the total squared prediction error as a function of p for $p = 1, \dots, 10$. You will have to find the predictor coefficients a_1, \dots, a_{10} for each model order p , and then calculate each of the prediction errors. What is an appropriate value for p , i.e., is there a value of p after which the decrease in prediction error is negligible?

```

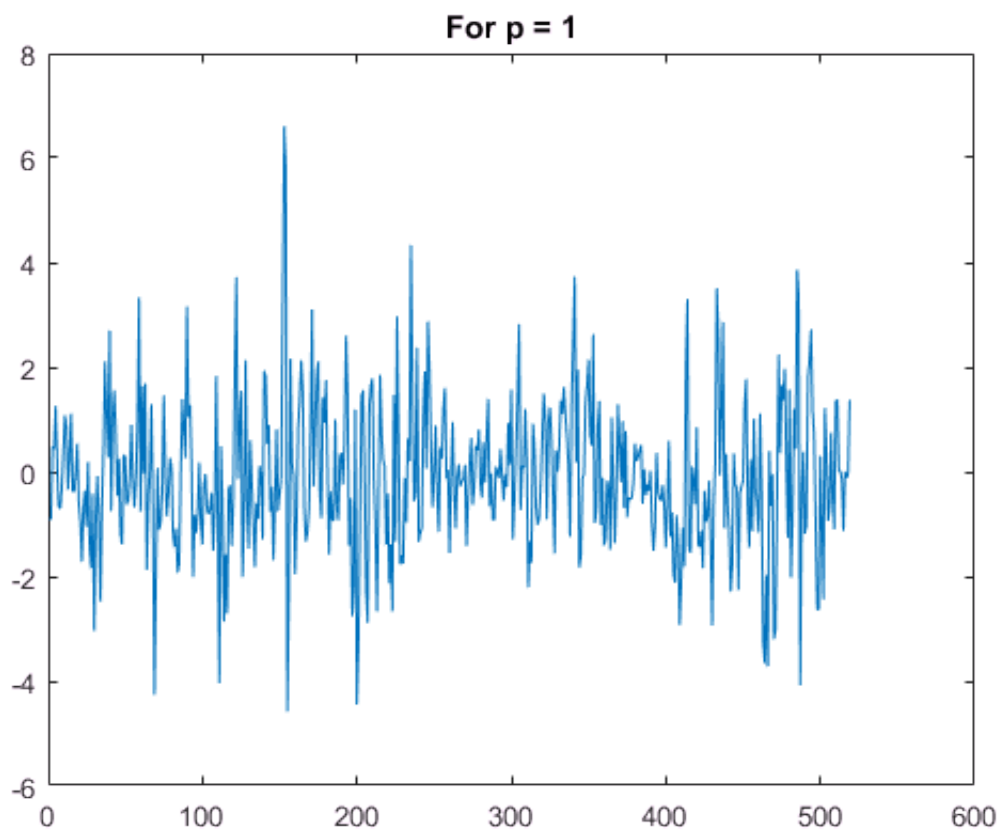
cells = cell(1,10);
for p = 1:10
    for i = 1:NN-p
        for j = 1:p
            X(i,j) = djia(i+j-1);
        end
    end
    cells{1,p} = X;
    clear X
end
cells = cell(1,10);
for p = 1:10
    for i = p+1:NN
        x(i-p,1) = djia(i);
    end
    cells{1,p} = x;
    clear x
end
% Value of coefficients
Cellsa = cell(1,10);
for p = 1:10
    Cellsa{1,p} = -cells{1,p}\cells{1,p};
end

```

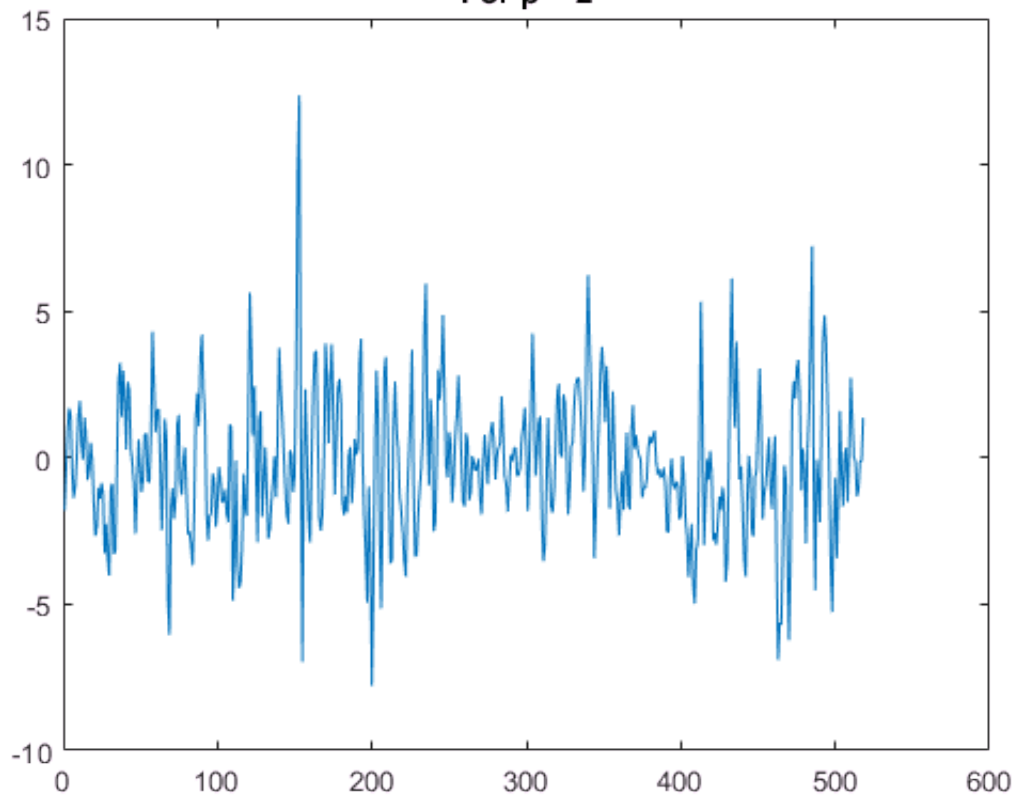
```

xhat = cell(1,10);
for p = 1:10
    xhat{1,p} = -cells{1,p}*Cellsa{1,p};
end
Cdjia = cell(1,10);
for p = 1:10
    Cdjia{1,p} = djia(1:NN-p);
end
Cerror = cell(1,10);
for p = 1:10
    Cerror{1,p} = Cdjia{1,p} - xhat{1,p};
    figure
    plot(Cerror{1,p})
    x = [num2str(p)];
    title(['For p = ',num2str(p)])
end

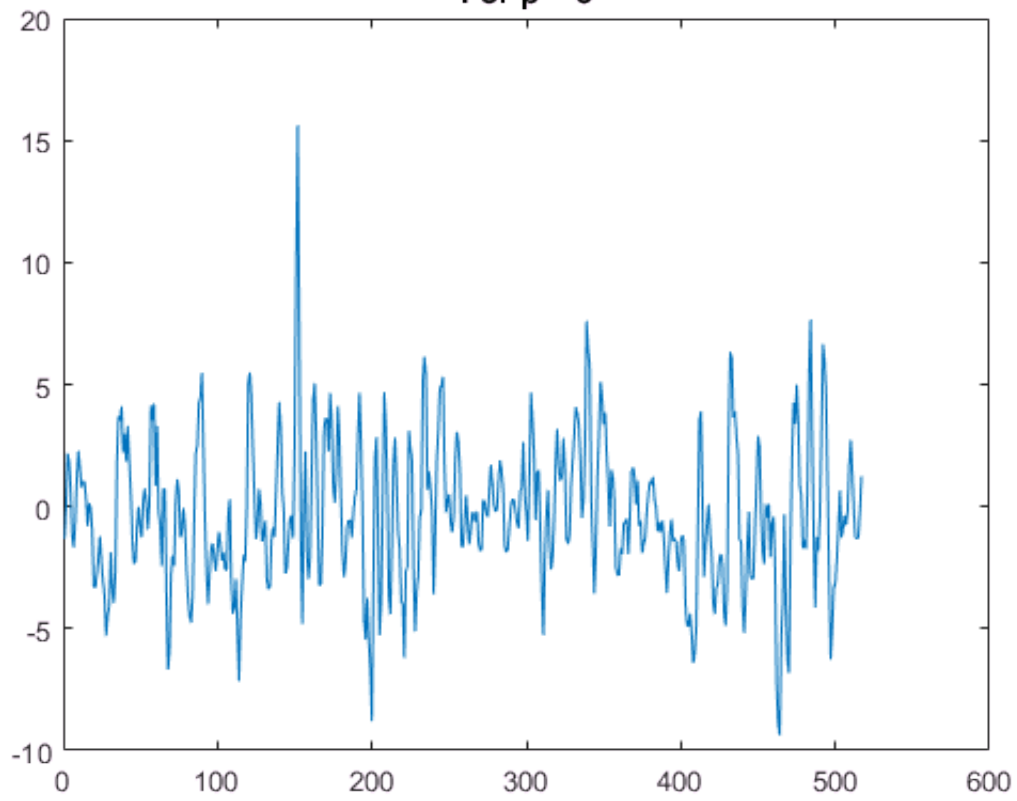
```



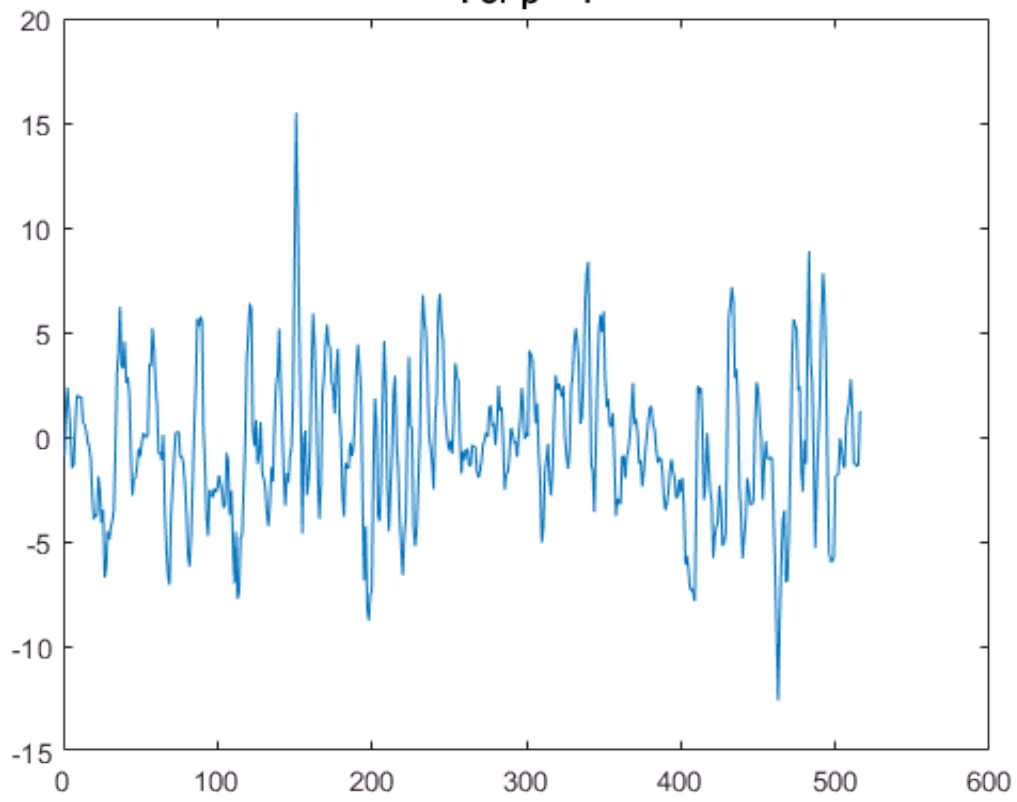
For $p = 2$



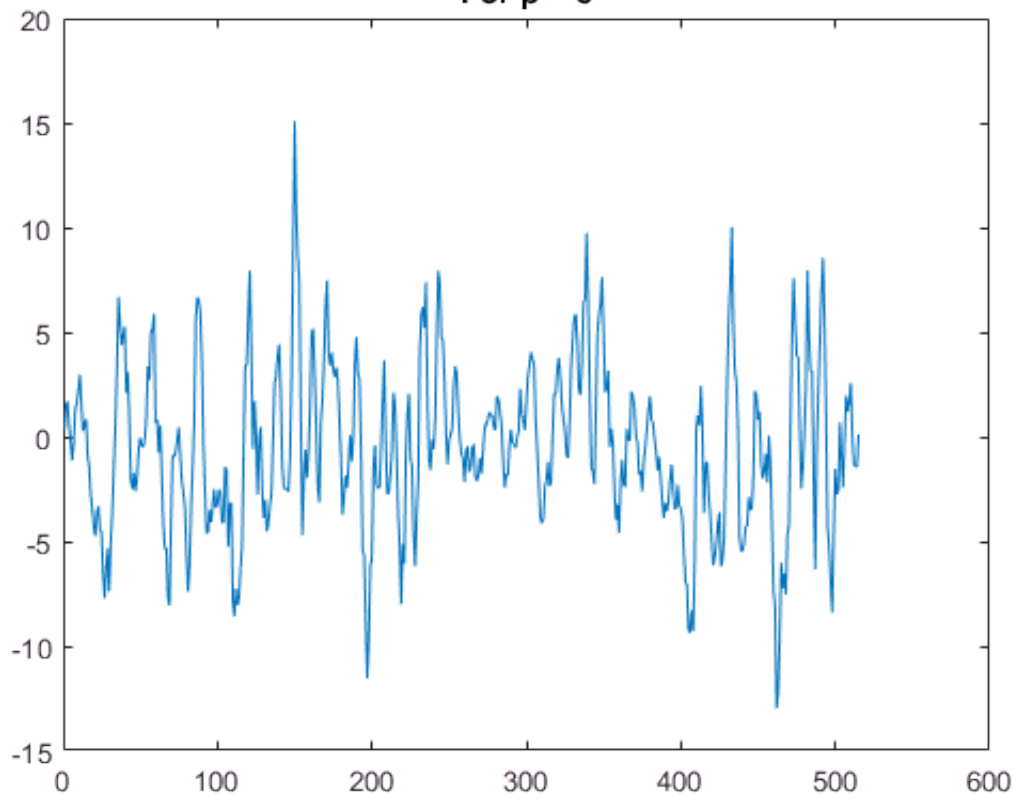
For $p = 3$



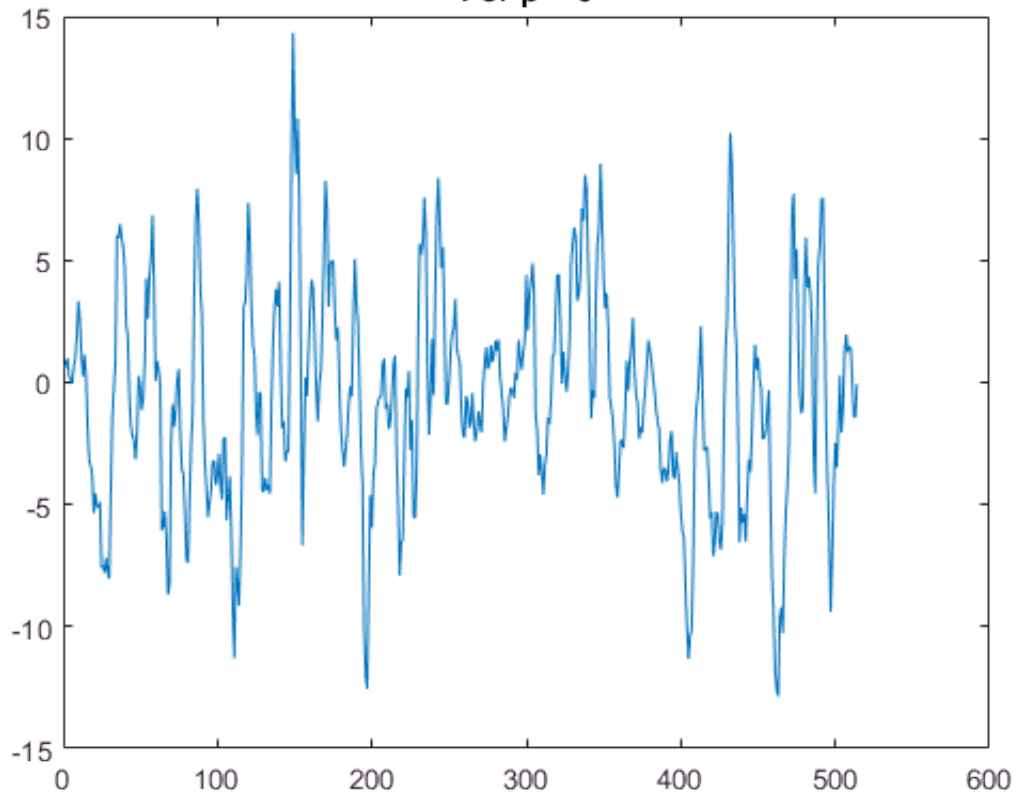
For $p = 4$



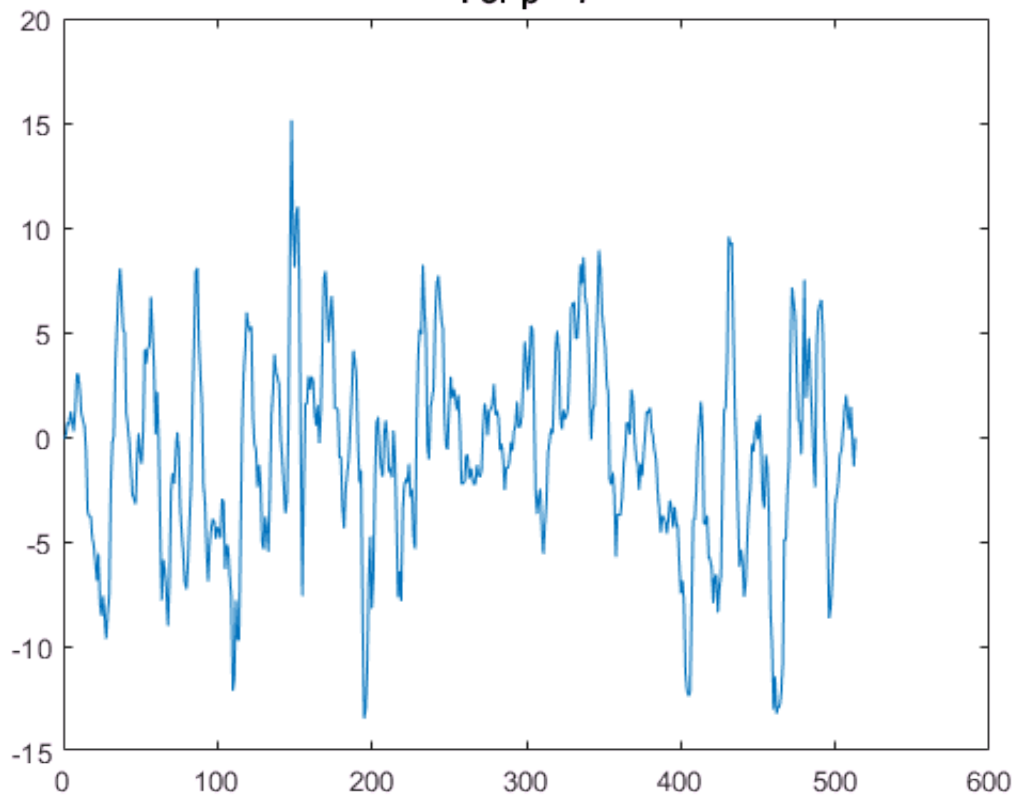
For $p = 5$



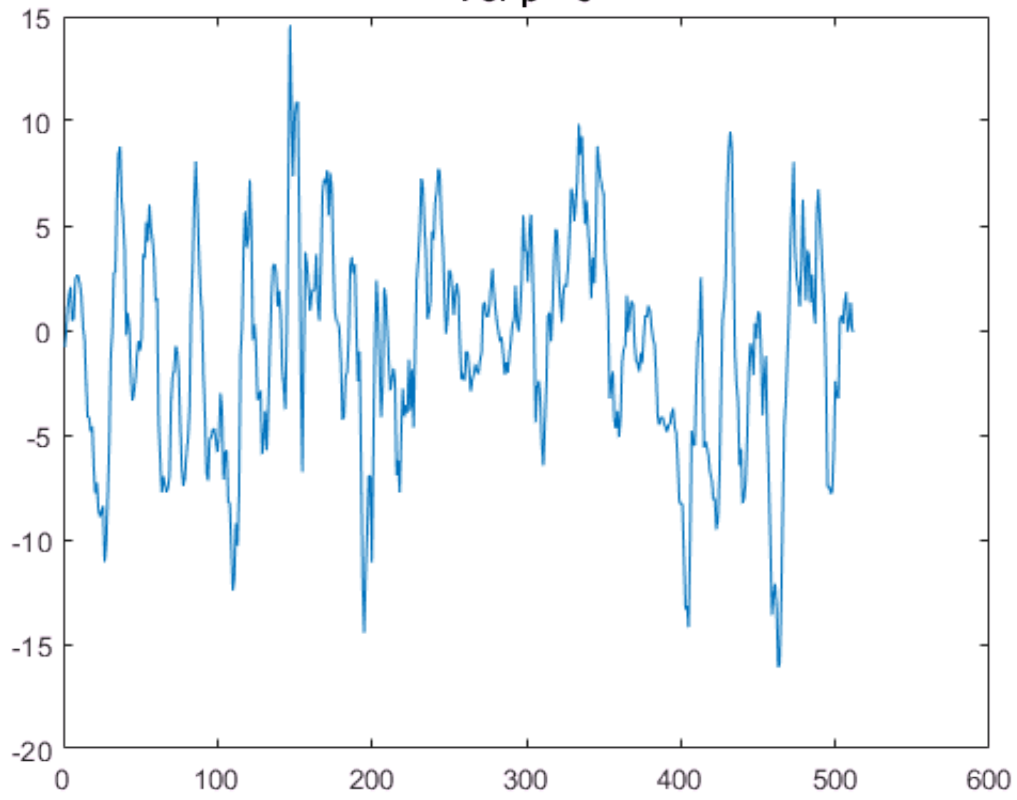
For $p = 6$



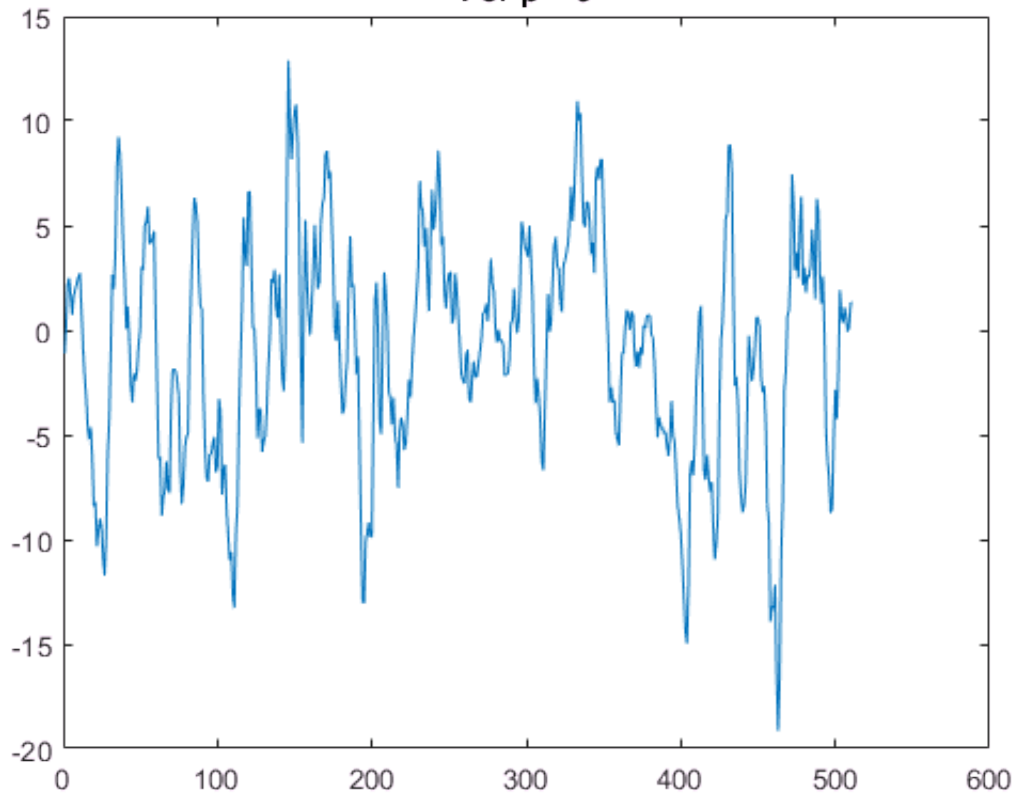
For $p = 7$

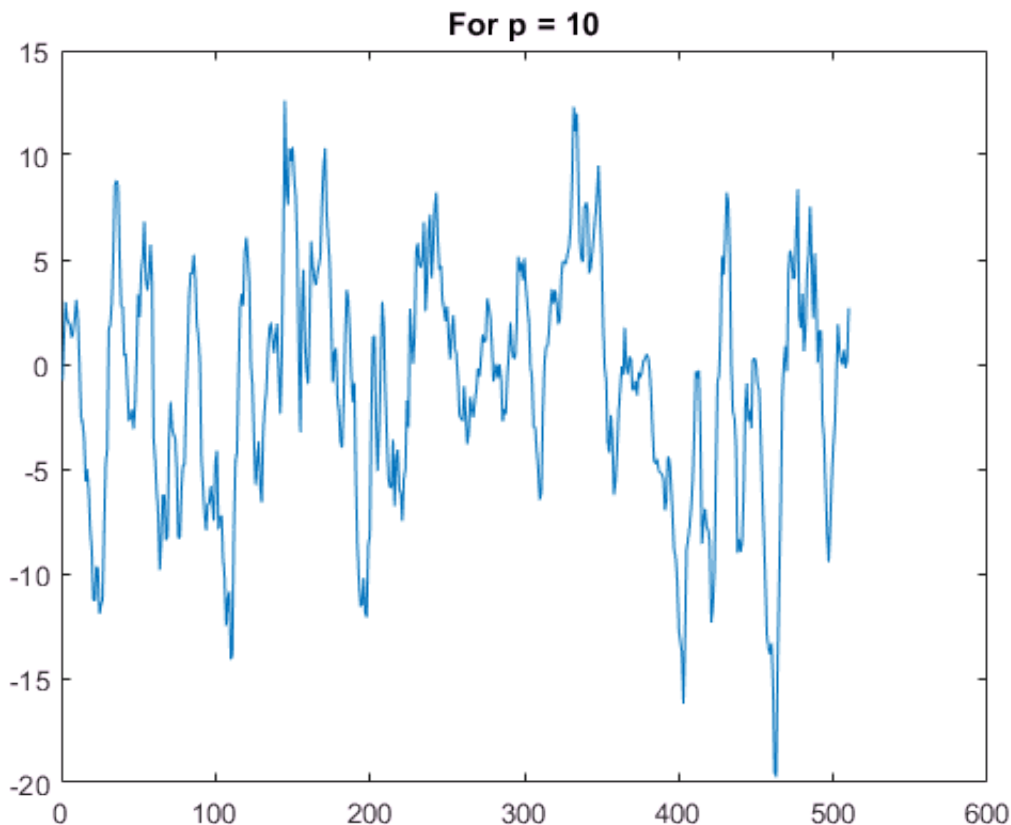


For $p = 8$



For $p = 9$





```
disp(['We have a decrease in prediction error for p = 1. We can say that for p = 1,...  
      'this prediction error is negligible'])
```

We have a decrease in prediction error for p = 1. We can say that for p = 1, this prediction error is negligible

(e) Given the predictor you designed based on the first decade of data and the model order you have selected from Part (d), you will now test the investment strategy outlined in the introduction. Give yourself \$1000 at the end of the p th week, and make 520 trading decisions based on the output of your predictor. First, determine an upper bound on the amount of money you could make. This would be how much you could make if you were omniscient, i.e., if you knew which direction the stock market was going each week and were always invested in the better of either the bank or the DJIA. Now, as a lower bound, calculate how much money you would make if you left all of your money in the bank and earned a gain of $(1 + 0.03152)$ each week. As another lower bound, determine how much you would make with the "buy-and-hold" strategy, where you put all your money in the DJIA every week. Finally, calculate how much money you would make with your predictor. What is the equivalent APR that the bank would have had to pay you to achieve the same gain as your predictor?

```
%le
if (rng_num == 1)
    xhat_u = max(xhat1)/xhat1(1);
    upper_bound = 1000*xhat_u;
    txt3 = ['Based on our prediction, in 520 weeks we will have ',...
            num2str(upper_bound)];
    disp(txt3)
else
    xhat_u = max(xhat1)/xhat1(1);
    upper_bound = 500*xhat_u;
    txt3 = ['Based on our prediction, in 520 weeks we will have ',...
            num2str(upper_bound)];
```

```
disp(txt3)
end
```

Based on our prediction, in 520 weeks we will have 2395.5802

```
if (rng_num == 1)
    lower_bound = 1000*(1+0.03/52)^520;
    txt4 = [' Within 520 weeks with 3% the minimal amount we can make is ',...
            num2str(lower_bound)];
    disp(txt4)
else
    lower_bound = 500*(1+0.03/52)^520;
    txt4 = [' Within 520 weeks with 3% the minimal amount we can make is ',...
            num2str(lower_bound)];
    disp(txt4)
end
```

Within 520 weeks with 3% the minimal amount we can make is 1349.742

```
if (rng_num == 1)
    lower_bound2 = 1000*xhat1(end)/xhat1(1);
    txt5 = [' If we were to buy and hold, using $1000 we would yeild ',...
            num2str(lower_bound2)];
    disp(txt5)
else
    lower_bound2 = 500*xhat1(end)/xhat1(1);
    txt5 = [' If we were to buy and hold, using $500 we would yeild ',...
            num2str(lower_bound2)];
    disp(txt5)
end
```

If we were to buy and hold, using \$1000 we would yeild 2223.1287

```
rr = ((xhat1(end)/xhat1(1))^(1/NN)-1)*52;
txt6 = ['To have the same, the APR rate should be ',num2str(rr*100),'%'];
disp(txt6)
```

To have the same, the APR rate should be 7.9953%

(f) Now use your prediction strategy on the most recent decade in the data, i.e., the last 520 weeks of the DJIA. Calculate how you did and how each of the bounds perform: best-possible, all in the bank account, and buy-and-hold. Also calculate the equivalent APR for your predictor.

```
if (rng_num == 1)
    xhat_u = max(xhat1)/xhat1(1);
    upper_bound = 1000*xhat_u;
    txt7 = ['The maximum amount of money that can be made is $',...
            num2str(upper_bound)];
    disp(txt7)
else
    xhat_u = max(xhat1)/xhat1(1);
    upper_bound = 500*xhat_u;
    txt7 = ['The maximum amount of money that can be made is $',...
            num2str(upper_bound)];
    disp(txt7)
end
```

The maximum amount of money that can be made is \$2395.5802

```
if (rng_num == 1)
    lower_bound = 1000*(1+0.03/52)^520;
    txt8 = [' The minimum amount we can make with 3% and in 520 weeks is $',...
    num2str(lower_bound)];
    disp(txt8)
else
    lower_bound = 500*(1+0.03/52)^520;
    txt8 = [' The minimum amount we can make with 3% and in 520 weeks is $',...
    num2str(lower_bound)];
    disp(txt8)
end
```

The minimum amount we can make with 3% and in 520 weeks is \$1349.742

```
if (rng_num == 1)
    lower_bound2 = 1000*xhat1(end)/xhat1(1);
    txt9 = [' If we were to buy and hold, using $1000 we would yeild ',...
    num2str(lower_bound2)];
    disp(txt9)
else
    lower_bound2 = 500*xhat1(end)/xhat1(1);
    txt9 = [' If we were to buy and hold, using $500 we would yeild ',...
    num2str(lower_bound2)];
    disp(txt9)
end
```

If we were to buy and hold, using \$1000 we would yeild 2223.1287

```
rr = ((xhat1(end)/xhat1(1))^(1/NN)-1)*52;
txt10 = ['To have the same, the APR rate should be ',num2str(rr*100),'%'];
disp(txt10)
```

To have the same, the APR rate should be 7.9953%