Problem 1:

<u>A.</u>

```
function [U, S, V] = mysvd(A)
n = size(A, 1);
p = size(A, 2);
[V, L] = jacobi(A' * A);
L = diag(L);
%sort V, L simultaneously
for i=1:p
max = i; %index of current max eigenvalue
   for j=i+1:p
       if (L(j) > L(i))
           max = j;
       end
    end
    if max ~= i %swap columns
       tmp L = L(i);
       L(i) = L(max);
       L(max) = tmp L;
       tmp V = V(:,i);
       V(:,i) = V(:,max);
       V(:,max) = tmp V;
    end
end
S = sqrt(diag(L));
if p > n
   S = S(1:n, 1:p);
else
    S = [S; zeros(p-n, p)];
end
U = A * V * mypinv(S);
%-----
function Sminus = mypinv(S)
m = size(S, 1);
n = size(S, 2);
Sminus = zeros(n, m);
p = min(m, n);
for i = 1:p
    if S(i,i) \sim= 0
       Sminus(i,i) = 1/S(i,i);
end
%Testing: -----
C = gallery('chow', 8);
F = hadamard(8);
H = hilb(8);
P = pascal(8);
```

0.5135 + 0.0000i

0.0000 + 0.0000i

0.0000 + 0.0000i

0.0000 + 0.0000i

```
0.4489 -0.3804 -0.2875 0.2053 0.1401 0.0873
                                                             -0.0420
                                                                         0.7071

    -0.3804
    -0.2875
    0.2053
    0.1401
    0.0873

    -0.1806
    0.1560
    -0.4215
    -0.5328
    -0.4746

                                                             -0.0420
0.4489
                                                                        -0.7071
0.4241
                                                               0.2765
                                                                          0.0000
                   0.4792
0.3876
         0.0667
                              -0.4049 0.0743
                                                   0.4903
                                                               -0.4537
                                                                         -0.0000
                   0.4329 0.2298 0.5029
0.3405
          0.2964
                                                   -0.1222
                                                              0.5368
                                                                         0.0000
                   0.0527 0.5137 -0.2766
-0.3681 0.0134 -0.3917
          0.4483
0.2839
                                                    -0.3415
                                                               -0.5086
                                                                          0.0000
                                                    0.5379
                                                              0.3749
0.2195
          0.4824
                                                                         0.0000
                   -0.5050 -0.5073 0.4341 -0.3133 -0.1635 -0.0000
0.1491
        0.3899
```

[U, S, V] = mysvd(F)

U=

 0.3536
 0.3536
 0.3536
 0.3536
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 0.3536
 0.3536
 0.3536

S =

2.828	4	0	0	0		0		0	(0	0
0	2.82	84	0	0		0		0	(0	0
0	0	2.82	84	0		0		0	(0	0
0	0	0	2.	8284		0		0	(0	0
0	0	0		0 2	.828	34		0	(0	0
0	0	0		0	0	2	.828	4		0	0
0	0	0		0	0		0	2.	828	4	0
0	0	0		0	0		0		0	2.	.8284

V =

1 0 0 0 0 0 0 0 1 0 0 0 0 0 0 0 1 0 0 0 0 0 Ω 0 0 1 0 0 0 0 0 0 0 1 0 0 0 0 0 0 0 0 1 0 0 0 0 0 0 0 1 0 0 0 0 0 0 0 0 1

[U, S, V] = mysvd(H)U =

Columns 1 through 6

Columns 7 through 8

 $\begin{array}{lll} 0.0006 + 0.0000i & 0.0000 - 0.0005i \\ -0.0199 + 0.0000i & 0.0000 + 0.0173i \\ 0.1676 + 0.0000i & 0.0000 - 0.1454i \\ -0.5264 + 0.0000i & 0.0000 + 0.4552i \\ 0.6052 + 0.0000i & 0.0000 - 0.5156i \end{array}$

```
0.3027 + 0.0000i 0.0000 - 0.2726i
S =
 Columns 1 through 6
 0.0000 + 0.0000i 0.2981 + 0.0000i 0.0000 + 0.0000i 0.0000 + 0.0000i 0.0000 + 0.0000i 0.0000 + 0.0000i
  0.0000 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0262 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0000 + 0.0000i
 0.0000 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0015 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0000 + 0.0000i
 0.0000 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0000 + 0.0000i \quad 0.0001 + 0.0000i \quad 0.0000 + 0.0000i
  0.0000 + 0.0000i \ \ 0.000i \ \ 0.0000i \ \
 0.0000 + 0.0000i \ 0.0000 + 0.0000i \ 0.0000 + 0.0000i \ 0.0000 + 0.0000i \ 0.0000 + 0.0000i \ 0.0000 + 0.0000i \ 0.0000 + 0.0000i
 0.0000 + 0.0000i 0.0000 + 0.0000i 0.0000 + 0.0000i 0.0000 + 0.0000i 0.0000 + 0.0000i 0.0000 + 0.0000i
 Columns 7 through 8
 0.0000 + 0.0000i 0.0000 + 0.0000i
  0.0000 + 0.0000i 0.0000 + 0.0000i
 V =
  0.7203 -0.6295 0.2775 0.0865 0.0207 0.0038 0.0005 0.0000
  0.2552 \quad 0.3276 \quad -0.0513 \quad 0.4592 \quad -0.0320 \quad -0.5797 \quad -0.5175 \quad 0.0953
  [U, S, V] = mysvd(P)
U=
  0.0004 -0.0101 -0.1115 0.5279 0.7379 0.3852 0.1234 -0.0246
  0.0026 -0.0469 -0.2879 0.5622 -0.0478 -0.6097 -0.4490 0.1523
  0.0110 -0.1313 -0.4686 0.3041 -0.4085 0.0148 0.5796 -0.4093
  0.0345 -0.2747 -0.5254 -0.1083 -0.1928 0.4431 -0.1412 0.6181
  0.0909 -0.4554 -0.3298 -0.3584 0.2497 -0.0005 -0.4067 -0.5650
  0.2107 -0.5801 0.1203 -0.1490 0.2768 -0.4362 0.4669 0.3122
  0.8657 \quad 0.4213 \quad -0.2171 \quad -0.1170 \quad 0.0837 \quad -0.0628 \quad 0.0345 \quad 0.0128
S =
 1.0e+03 *
  4.5437
                   0
                                     n
                           0
                                             n
                                                      0
                                                               0
                                                                        0
      0 0.1488
                           0
                                     0
                                             0
                                                      0
                                                               0
                                                                        0
               0 0.0119
                                     0
                                             0
                                                      0
                                                               0
                                                                        0
      0
                        0 0.0020
                                             0
                                                      0
                                                               0
               0
                                                                        0
      0
               0
                        0
                                0 0.0005
                                                      0
                                                               0
                                                                        0
       0
                                         0 0.0001
                                                               0
               0
                        0
                                 0
                                                                        0
```

0

0

0 0

0

0

0

0

0.0000

0

0

0.0000

```
    0.0004
    -0.0101
    -0.1115
    0.5279
    0.7379
    0.3852
    0.1234
    -0.0266

    0.0026
    -0.0469
    -0.2879
    0.5622
    -0.0478
    -0.6097
    -0.4490
    0.1523

    0.0110
    -0.1313
    -0.4686
    0.3041
    -0.4085
    0.0148
    0.5796
    -0.4094

    0.0345
    -0.2747
    -0.5254
    -0.1083
    -0.1928
    0.4431
    -0.1412
    0.6182

    0.0909
    -0.4554
    -0.3298
    -0.3584
    0.2497
    -0.0005
    -0.4067
    -0.5651

    0.2107
    -0.5801
    0.1203
    -0.1490
    0.2768
    -0.4362
    0.4669
    0.3123

    0.4434
    -0.4285
    0.4886
    0.3698
    -0.3213
    0.2984
    -0.2066
    -0.0965

    0.8657
    0.4213
    -0.2171
    -0.1170
    0.0837
    -0.0628
    0.0345
    0.0128
```

<u>B.</u>

Using the singular values in the S matrices printed above, here are the conditional numbers of each matrix:

Chow: 6.0208 / 0.6452 = 9.33 Hadamard: 2.8284/2.8284 = 1 Hilbert: 1.6959/0.0001 = 16959 Pascal: 4.5437 / 0.0001 = 45437

<u>C.</u>

```
A = double(imread('Joseph_Fourier_1820.jpg'))/255;
R = A(:,:,1);
G = A(:,:,2);
B = A(:,:,3);
A = (R+G+B)/3;

[U, S, V] = mysvd(A);
S(1:5, 1:5) = 0;
Serror5 = S;
Aerror5 = U*Serror5*V';
imshow(Aerror5);
```



```
S(1:10, 1:10) = 0;
Serror10 = S;
Aerror10 = U*Serror10*V';
imshow(Aerror10);
```



```
S(1:20, 1:20) = 0;
Serror20 = S;
Aerror20 = U*Serror20*V';
imshow(Aerror20);
```



```
S(1:50, 1:50) = 0;
Serror50 = S;
Aerror50 = U*Serror50*V';
imshow(Aerror50);
```

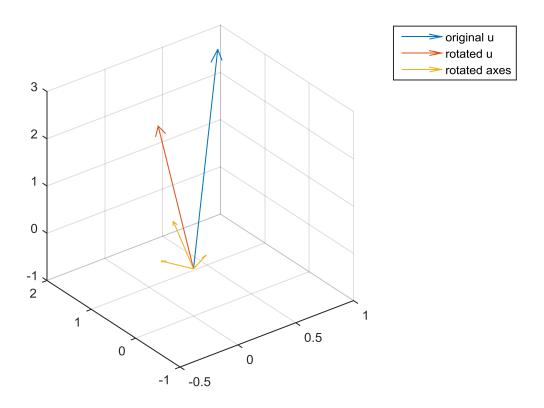


Problem 2:

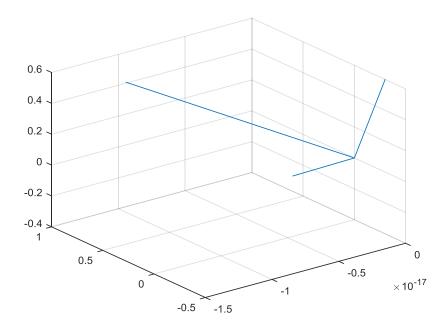
```
<u>A.</u>
```

```
function qinv = quaternioninverse(q)
qinv = [q(1) -q(2:4)] / (q*q');
q = [8 \ 2 \ 3 \ 1];
qinv = quaternioninverse(q)
ginv =
    0.1026 -0.0256 -0.0385 -0.0128
qinv * (q*q')
ans =
   8.0000 -2.0000 -3.0000 -1.0000
qinv * norm(q)
ans =
    0.9058 -0.2265 -0.3397 -0.1132
function q = rotationquaternion(theta, v)
v = v/norm(v);
q = [\cos(theta/2) \sin(theta/2)*v];
x = [1 \ 0 \ 0];
theta = pi/6;
z = [0 \ 0 \ 1];
x = [0 x];
q = rotationquaternion(theta, z);
tmp = quaternionmultiply(quaternioninverse(q), x);
w = quaternionmultiply(tmp, q)
w =
         0 0.8660 -0.5000 0
<u>D.</u>
u = [1 \ 2 \ 3];
theta = pi/4;
v = [1 \ 1 \ 1];
u = [0 \ u];
q = rotationquaternion(theta, v);
tmp = quaternionmultiply(quaternioninverse(q), u);
w = quaternionmultiply(tmp, q)
q1 = quiver3(0,0,0, 1, 2, 3);
hold on;
q2 = quiver3(0,0,0, w(1), w(2), w(3));
```

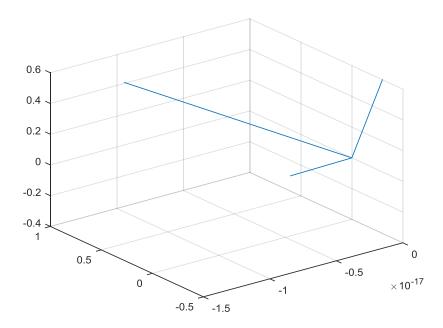
```
hold on;
%rotate axes
tmp = quaternionmultiply(quaternioninverse(q), [0 1 0 0]);
x = quaternionmultiply(tmp, q);
tmp = quaternionmultiply(quaternioninverse(q), [0 0 1 0]);
y = quaternionmultiply(tmp, q);
tmp = quaternionmultiply(quaternioninverse(q), [0 0 0 1]);
z = quaternionmultiply(tmp, q);
q3 = quiver3([0,0,0], [0,0,0], [0,0,0], [x(1) y(1) z(1)], [x(2) y(2) z(2)],
[x(3), y(3), z(3)]);
legend([q1 q2 q3], 'original u', 'rotated u', 'rotated axes');
```



```
E.
theta = pi/3;
v = [1 1 1];
q = rotationquaternion(theta, v);
tmp = quaternionmultiply(quaternioninverse(q), [0 1 0 0]);
x = quaternionmultiply(tmp, q);
tmp = quaternionmultiply(quaternioninverse(q), [0 0 1 0]);
y = quaternionmultiply(tmp, q);
tmp = quaternionmultiply(quaternioninverse(q), [0 0 0 1]);
z = quaternionmultiply(quaternioninverse(q), [0 0 0 1]);
z = quaternionmultiply(tmp, q);
graph = quiver3([0,0,0], [0,0,0], [0,0,0], [x(1) y(1) z(1)], [x(2) y(2) z(2)], [x(3), y(3), z(3)]);
graph.ShowArrowHead = 'off';
```



```
p = -q;
tmp = quaternionmultiply(quaternioninverse(p), [0 1 0 0]);
x = quaternionmultiply(tmp, p);
tmp = quaternionmultiply(quaternioninverse(p), [0 0 1 0]);
y = quaternionmultiply(tmp, p);
tmp = quaternionmultiply(quaternioninverse(p), [0 0 0 1]);
z = quaternionmultiply(tmp, p);
graph = quiver3([0,0,0], [0,0,0], [0,0,0], [x(1) y(1) z(1)], [x(2) y(2) z(2)], [x(3), y(3), z(3)]);
graph.ShowArrowHead = 'off';
```



The two graphs look the same, using rotation q and p = -q.

Problem 3:

<u>A.</u>

```
A = zeros(14800, 13);
for i=1:13
   F = convertimage(sprintf('faces/basis/f%d.jpg', i));
   f = F(:);
   A(:,i) = f/norm(f);
end
%-----
function A = convertimage(Img)
A = double(imread(Img))/255;
R = A(:,:,1);
G = A(:,:,2);
B = A(:,:,3);
A = (R+G+B)/3;
T2 = convertimage('faces/tests/t2.jpg');
b = T2(:);
<u>C.</u>
x = pinv(A'*A)*A'*b;
v = A*x;
v = v/(max(v));
imshow(reshape(v,148,100));
```

imshow(T2);



```
%squared error
norm(v-b)^2
ans =
295.5664
```

```
3.3883
6.2665
-2.7240
32.5422
13.7122
12.4288
-6.4815
-3.6926
14.9529
-16.5462
12.0888
0.5861
23.4545
```

Based on the numbers above, the three basis images corresponding to absolute largest coefficients are: f4, f13, f10.

<u>E.</u>

RHO = corr(A)

Columns 1 through 12

```
1.0000
                   0.7890 0.7363
                                              0.7252
            0.7795
                                     0.6467
                                                      0.7518
        0.7336
                        0.7474
                0.6895
                                  0.6838
          1.0000
   0.7795
                   0.8511
                             0.7576
                                    0.7304
                                              0.7522
                                                      0.8225
0.7635 0.8120 0.7794
                        0.8189
                                0.7193
   0.7890 0.8511 1.0000 0.8183
                                                      0.8861
                                    0.7568
                                              0.7670
0.7723 0.8914 0.8243
                        0.8492
                                 0.7969
   0.7363
         0.7576
                   0.8183
                           1.0000
                                    0.8242
                                              0.8538
                                                      0.7551
0.6620 0.8038
               0.7517
                        0.7610
                                  0.7618
   0.6467
          0.7304
                    0.7568
                             0.8242
                                     1.0000
                                              0.7922
                                                      0.7513
0.6919
        0.8157
               0.8221
                        0.7577
                                  0.7650
   0.7252
         0.7522
                   0.7670
                             0.8538
                                    0.7922
                                              1.0000
                                                      0.7258
0.6858 0.7477 0.7390
                       0.7161
                                  0.7190
   0.7518
         0.8225
                    0.8861
                             0.7551
                                    0.7513
                                              0.7258
                                                      1.0000
0.7801 0.9060
               0.8846
                        0.8955
                                  0.8116
   0.6863 0.7635
                    0.7723
                             0.6620
                                     0.6919
                                              0.6858
                                                      0.7801
1.0000 0.7774
                0.7322
                         0.8152
                                  0.8004
                                                      0.9060
   0.7336
          0.8120
                   0.8914
                             0.8038
                                     0.8157
                                              0.7477
0.7774 1.0000
               0.8889
                         0.9135 0.8539
   0.6895 0.7794 0.8243
                             0.7517 0.8221
                                              0.7390
                                                      0.8846
0.7322 0.8889
               1.0000
                        0.8354
                                0.7966
                   0.8492
   0.7474
         0.8189
                             0.7610
                                    0.7577
                                              0.7161
                                                      0.8955
0.8152
        0.9135
               0.8354
                         1.0000
                                  0.8171
           0.7193
                    0.7969
                                              0.7190
   0.6838
                             0.7618
                                     0.7650
                                                      0.8116
0.8004
        0.8539
                 0.7966
                         0.8171
                                  1.0000
   0.7091
           0.7694
                    0.8120
                             0.7698
                                     0.7801
                                              0.7246
                                                      0.8482
```

```
0.7091
   0.7694
   0.8120
   0.7698
   0.7801
   0.7246
   0.8482
   0.8308
   0.8887
   0.8168
   0.8945
   0.8915
   1.0000
RHO = corr(A);
RHO2 = RHO;
RHO2(logical(eye(13))) = 0;
[Y I] = max(RHO2)
Highest correlation: 0.9135, between images f9 and f11.
COEFF = pca(RHO)
COEFF =
  -0.1624 -0.4603 -0.3172 0.3390 -0.3971
                                           -0.1007 0.1143
0.0415 -0.2349 -0.1375 0.0713 0.1211
   0.0608 -0.2289 -0.3685 -0.2964 0.4712
                                           -0.3551 -0.2131
0.1687 -0.0541 -0.3998 0.1601 0.2570
                                           0.1229
                                                   -0.4365
0.4040 -0.3343 -0.1357 0.1276 -0.4170
  -0.1984 0.3628 -0.2328 0.4436 0.2679
                                           -0.1811
                                                   -0.0451
0.2250 0.5976 -0.0847 0.0121 0.1113
  -0.0296 0.5594 -0.0013 -0.2822 -0.1098
                                           -0.4657
                                                   -0.0314
0.2086 -0.4063 0.1995 0.1102 -0.0038
  -0.3115 0.2780 -0.1059 0.0980 0.4081
                                           0.5306 0.3567
0.2281 \quad -0.3711 \quad -0.0227 \quad -0.0006 \quad 0.0159
                                           0.3071 0.0610
   0.3621 -0.0210 -0.3243 -0.0465 -0.0571
0.0744 0.1564 0.6759 0.3360 0.2341
   0.2917 -0.2622 0.4251 -0.1785 0.4179
                                           0.1052 0.0145
0.4128 0.0227 -0.1619 0.0106 0.2035
   0.3501 0.1691 -0.2319 0.1126 -0.0155
                                           -0.0429 0.0617
0.0787 -0.2459 -0.2608 -0.3330 0.6699
   0.2865 0.2702 -0.2471 -0.3710 -0.3257
                                           0.3300 -0.0337
0.3839 -0.0460 -0.1402 0.1012 0.0985
                                           -0.2098
                                                   0.5675
0.0492 0.0368 0.1494 -0.4571 -0.4543
   0.3124 0.1701 0.2923 0.4421 -0.0759
                                           0.1179 -0.4706
0.3666 -0.1004 0.1873 -0.2841 -0.0662
   0.3720 0.0951 0.1804 0.3091 0.0642
                                           -0.2085 0.2614
0.2504 -0.0758 -0.2702 0.6729 -0.0578
```

Column 13

The first two principal components are the first 2 columns of the above matrix.

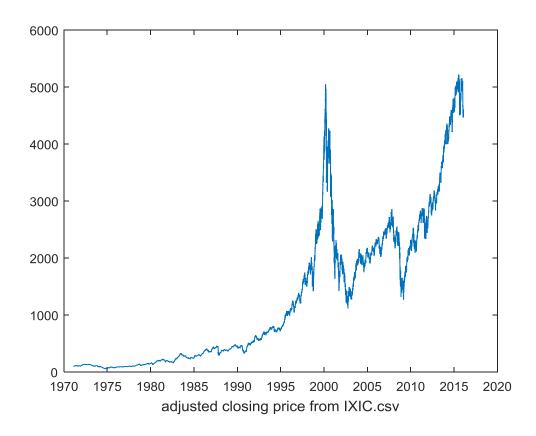
```
G.
c1 = COEFF(:,1);
c2 = COEFF(:,2);
%pairwise distances
D = squareform(pdist([c1 c2]))
D(logical(eye(13))) = Inf;
m = min(D)
```

Images f7 and f11 have coordinates closest to each other.

Problem 4:

<u>A.</u>

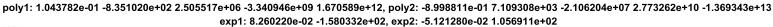
```
[time ixic] = read_stock('IXIC.csv');
```

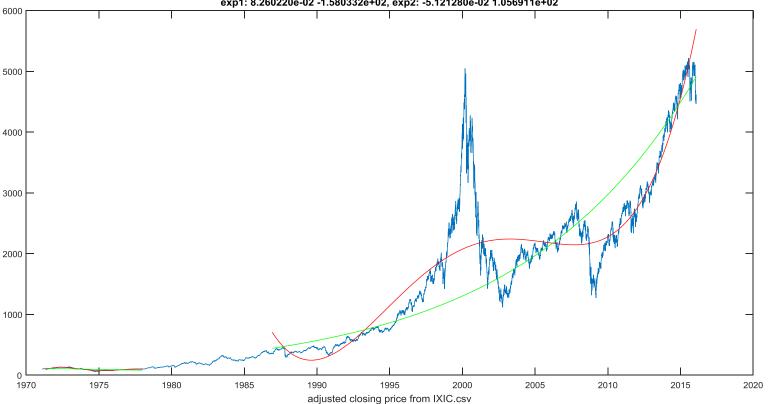


<u>B.</u>

```
[time ixic] = read_stock('IXIC.csv');
t1 = time(2:7350);
y1 = ixic(2:7350);
t2 = time(9611:11287);
```

```
y2 = ixic(9611:11287);
%Polynomial Fit:
%First time period:
X4 = [t1.^4 t1.^3 t1.^2 t1 t1.^0];
clp = X4 \ y1; %find coefficients of degree 4 polynomial
%Second time period:
X4 = [t2.^4 t2.^3 t2.^2 t2 t2.^0];
c1p = X4 \setminus y2; %find coefficients of degree 4 polynomial
%Exponential fit:
%First time period:
Ylog = log(y1);
T1 = [t1.^0 t1];
cllog = Ylog \ T1
%Second time period:
Ylog = log(y2);
T2 = [t2.^0 t2];
c2log = Ylog \setminus T2
%Polynomial Fit:
%First time period:
c1p = polyfit(t1, y1, 4); %find coefficients of degree 4 polynomial
%Second time period:
c2p = polyfit(t2, y2, 4); %find coefficients of degree 4 polynomial
%Exponential fit:
%First time period:
ylog = log(y1);
c1log = polyfit(t1, ylog, 1);
polylog1 = polyval(c1log, t1);
%Second time period:
ylog = log(y2);
c2log = polyfit(t2, ylog, 1);
polylog2 = polyval(c2log, t2);
hold on;
plot(t1, polyval(c1p, t1), 'r', t2, polyval(c2p, t2), 'r');
hold on;
plot(t1, exp(polylog1), 'g', t2, exp(polylog2), 'g');
hold on;
title(sprintf('poly1: %d %d %d %d %d, poly2: %d %d %d %d %d \nexp1: %d %d,
exp2: %d %d', c1p, c2p, c1log, c2log))
```





Squared Errors:

```
%squared errors:
polyerror1 = norm(polyval(c1p, t1) - y1)^2
polyerror2 = norm(polyval(c2p, t2) - y2)^2
experror1 = norm(exp(polylog1) - y1)^2
experror2 = norm(exp(polylog2) - y2)^2
polyerror1 =
    1.5922e+09

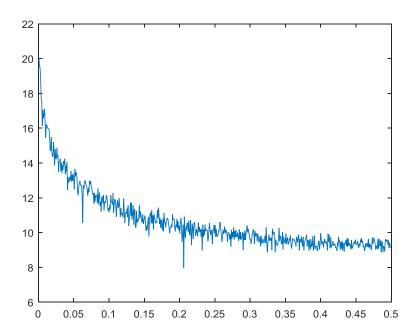
polyerror2 =
    9.2822e+04

experror2 =
    3.3657e+09

experror2 =
    4.4669e+05
```

It looks like the polynomial function fits better, since it has smaller errors for both time periods.

Problem 5:



The power spectrum value at the spike is 7.9806, based on the output of $\log_p \text{power_spectrum}(2:floor(n/2))$, which shows a suddenly low value in the middle of values around ~10.

$$I = find(v < 8)$$

 $I = 259$

The index is at 259, so looking at the frequency vector, the frequency corresponding to this spike is frequencies (259)

Per month, this value is 0.2051 * 252/12 = 4.3071.