

## MATLAB (Problems 1-3)

### Output:

```

-----
Oscar Martinez           Homework 5: Problems 1-3           STA 5106
-----
-----Problem 1-----
---Part (i): Simple Iterations---

i =

106

---Part (ii): Newton-Raphson---

x =

0.7854    0.3756    0.0963    0.0026    0.0000    0.0000

i =

6

---Part (iii): Plot---
-----Problem 2-----

m =

2

K =

0.5000

x =

Columns 1 through 9
-0.6000    -0.5530    -0.5274    -0.5139    -0.5070    -0.5035    -0.5018    -0.5009    -0.5004

Columns 10 through 18
-0.5002    -0.5001    -0.5001    -0.5000    -0.5000    -0.5000    -0.5000    -0.5000    -0.5000

```

i =

18

Kalt =

0.5000

Malt =

2

-----Problem 3-----

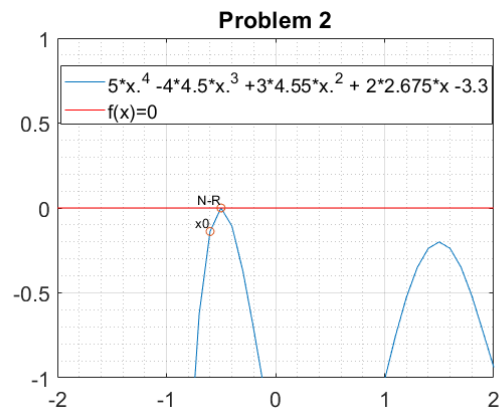
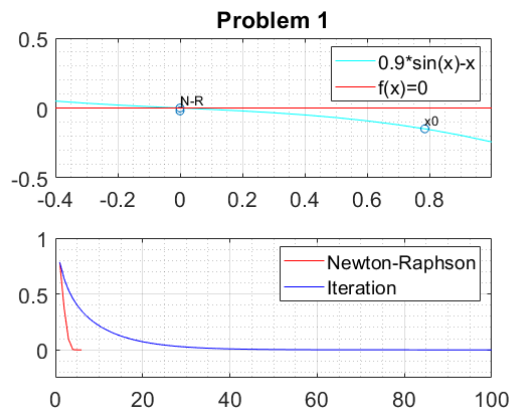
i =

7

ans =

10.0670

## Figures:



## Code:

```
1 clc
2 clear
3
```

```
4 % Diary
5 dfile = 'MATLAB_Output_OM.txt';
6 if exist(dfile, 'file') ; delete(dfile); end
7 diary(dfile)
8 diary on
9 diary MATLAB_Output_OM.txt
10
11 %Introduction
12 fprintf('_____\\n')
13 ;
14 fprintf('Oscar Martinez \\t Homework 5: Problems 1-3 \\t STA 5106\\n');
15 fprintf('_____\\n')
16 ;
17 %-----Problem 1:-----
18 fprintf('_____Problem 1_____\\n');
19
20 %Part i
21 fprintf('---Part (i): Simple Iterations---\\n');
22
23 %Define the function inline
24 f = inline('0.9*sin(x)-x', 'x');
25
26 x0 = pi/4;
27
28 xa(1) = x0;
29 gxa = f(xa(1))+xa(1);
30 i = 1;
31 while (abs(xa(i) - gxa) > 1e-6)
32 gxa = xa(i);
33 xa(i+1) = f(xa(i)) + xa(i);
34 i = i+1;
35 end
36 %xa(i)
37 i
38
39 %Part ii
40 fprintf('---Part (ii): Newton-Raphson---\\n');
41
42 % define the function
43 h = inline('0.9*sin(x)-x', 'x');
44 x0 = pi/4;
45 dh = inline('0.9*cos(x)-1', 'x');
```

```
47 %The N-R algorithm
48 clear x;
49 x0 = pi/4;
50 x(1) = x0;
51 gx = x(1)-h(x(1))/dh(x(1));
52 i = 1;
53 while (abs(x(i) - gx) > 1e-6)
54     gx = x(i);
55     x(i+1) = x(i) - h(x(i))/dh(x(i));
56     i = i+1;
57 end
58 x
59 i
60
61 %Part iii
62 fprintf('---Part (iii): Plot---\n');
63
64 % plot the function
65 t = -1:0.1:2;
66 yt = f(t);
67 figure(1);
68 subplot(2,1,1);
69 Y=plot(t,yt, 'c-');
70 hold on;
71 XP=[pi/4 xa(106) x(5)];
72 YP=[f(pi/4) f(xa(11)) f(x(5))];
73 labels = {'x0', 'I', 'N-R'};
74 plot(XP,YP,'o');
75 text(XP,YP,labels,'VerticalAlignment','bottom','HorizontalAlignment','left'
76     )
77 Z=plot([-1 1], [0 0], 'r');
78 grid on;
79 grid minor;
80 title('Problem 1')
81 axis([-0.4 1 -0.5 0.5]);
82 set(gca, 'fontsize', 16);
83 legend([Y Z],{'0.9*sin(x)-x', 'f(x)=0'})
84 subplot(2,1,2);
85 plot(x, 'r');
86 grid on;
87 grid minor;
88 hold on;
89 plot(xa, 'b');
90 set(gca, 'fontsize', 16);
91 axis([0 100 -0.25 1])
```

```
91 legend('Newton-Raphson','Iteration')
92 hold off;
93
94
95 %-----Problem 2:-----
96 fprintf('-----Problem 2-----\n');
97 clear x;
98
99 %Define the function
100 f2 = inline('x.^5 - 4.5*x.^4 + 4.55*x.^3 + 2.675*x.^2 - 3.3*x - 1.4375', 'x');
101
102 %Find the Roots
103 p=[1 -4.5 4.55 2.675 -3.3 -1.4375];
104 r=roots(p);
105
106 %Find the multiplicity of root rt
107 rt=-0.5; %Define the wanted root
108 [s,t]=size(r);
109 m=0;
110 for j = 1:s
111     if abs(rt-r(j)) < 1e-6
112         m=m+1;
113     end
114 end
115 m
116 K=(m-1)/m
117
118 %Begin the N-R Algorigthm
119 x0 = -0.6;
120 df2 = inline('5*x.^4 - 4*4.5*x.^3 + 3*4.55*x.^2 + 2*2.675*x - 3.3', 'x');
121 clear x;
122 x(1) = x0;
123 gx = x(1)-f2(x(1))/df2(x(1));
124 i = 1;
125 while (abs(x(i) - gx) > 1e-6)
126     gx = x(i);
127     x(i+1) = x(i) - f2(x(i))/df2(x(i));
128     i = i+1;
129 end
130 x
131 i
132
133 %Alternate way to find K
134 %Get E
135 for j = 1:i-1
```

```

136 E(j)=abs(x(j)-x(j+1));
137 end
138 %K~Ei+1/E
139 for j = 1:i-2
140 Kalt=min(E(j+1)/E(j));
141 end
142 Kalt %K=(m-1)/m
143 Malt=1/(1-K) %1/(1-K)
144
145 %Plot
146 figure(2)
147 t=[-5:0.1:5];
148 yt=f2(t);
149 Y=plot(t, yt);
150 hold on;
151 Z=plot([-5 5], [0 0], 'r');
152 %plot(r, 0, 'go', r, f2(r), 'co', x(i), f2(x(i)), 'ro');
153 XP2=[-0.6 x(i)];
154 YP2=[f2(-0.6) f2(x(18))];
155 labels = {'x0', 'N-R'};
156 plot(XP2,YP2,'o');
157 text(XP2,YP2,labels,'VerticalAlignment','bottom','HorizontalAlignment','
    right')
158 axis([-2 2 -1 1]);
159 legend([Y Z],{'5*x.^4 -4*4.5*x.^3 +3*4.55*x.^2 + 2*2.675*x -3.3','f(x)=0'})
    ;
160 ax=gca;
161 ax.FontSize=16;
162 grid on;
163 grid minor;
164 title('Problem 2')
165 hold off;
166
167
168 %——Problem 3:——
169 fprintf('——Problem 3——\n');
170
171 clear
172 %Load the data
173 load hw5_3_data.mat
174 [m,n]=size(X);
175
176 theta0 = 7;
177
178

```

```

179 %N-R Algo
180 theta(1) = theta0;
181 %LogL=LogL + x(i) - X(j)-2*log(1+exp(x(i)-X(j)));
182 i = 1;
183 dtheta = theta(1)+.5;
184 while (abs(theta(i) - dtheta) > 1e-6)
185 dtheta = theta(i);
186 dLogL = sum(1-2*(exp(theta(i)-X)./(1+exp(theta(i)-X))));
187 ddLogL = -2*sum(exp(theta(i)-X)./(1+exp(theta(i)-X)).^2);
188 theta(i+1) = theta(i) - dLogL/ddLogL;
189 i = i+1;
190 end
191 i
192 theta(i)
193
194 diary off

```

### Problem 3

Let  $X_1, X_2, \dots, X_n$  be independent and identically distributed samples from a logistic distribution with the probability density function

$$f(x|\theta) = \frac{\exp(\theta - x)}{(1 + \exp(\theta - x))^2}$$

Given the values of  $X_1, X_2, \dots, X_n$  in “hw5\_3\_data” from the blackboard website, our goal is to find the maximum likelihood estimate (MLE) of  $\theta$ , using the following steps:

**(a)**

Derive an expression for the log likelihood function

$$l(\theta) = \sum_{i=1}^n \log(f(X_i|\theta)),$$

such that the MLE is given by

$$\hat{\theta} = \arg \max_{\theta} l(\theta).$$

$$\begin{aligned}
l(\theta) &= \sum_{i=1}^n \log(f(X_i|\theta)) \\
&= \sum_{i=1}^n \log\left(\frac{\exp(\theta - X_i)}{(1 + \exp(\theta - X_i))^2}\right) \\
&= \sum_{i=1}^n \log(\exp(\theta - X_i)) - 2 \log(1 + \exp(\theta - X_i)) \\
&= n\theta - \sum_{i=1}^n (X_i - 2 \log(1 + \exp(\theta - X_i)))
\end{aligned}$$

**(b)**

Find the expression for  $\dot{l}(\theta)$  and  $\ddot{l}(\theta)$ , the first and the second derivatives of  $l$  with respect to  $\theta$ . Verify that  $\ddot{l}(\theta) < 0$ .

$$\begin{aligned}
\dot{l} &= \frac{dl(\theta)}{d\theta} = n - 2 \left[ \sum_{i=1}^n \frac{\exp(\theta - X_i)}{1 + \exp(\theta - X_i)} \right] \\
\ddot{l} &= \frac{d^2l(\theta)}{d\theta^2} = -2 \left[ \sum_{i=1}^n \frac{\exp(\theta - X_i)}{(1 + \exp(\theta - X_i))^2} \right]
\end{aligned}$$

As  $\exp(\alpha) > 0$ ,  $\forall \alpha \in \mathbb{R}$ , the numerator and denominator of this expression are both positive. Thus since the quotient is positive and is being multiplied by a negative number, the expression must be less than 0, as needed.

**(c)**

See above output.

## Problems 4-5

```

In [62]: #Problem 4
print("-----Problem 4-----")
from numpy import *
from matplotlib import pyplot
set_printoptions(precision=4)

# define the function
f = lambda x: 0.9*sin(x)-x
df = lambda x: 0.9*cos(x)-1

#Part i
print("---Part(i) Simple Iterations---")

```



```
x0 = pi/4
xa0 = pi/4

#Algorithm
xa = zeros(200)
xa[0]= xa0
gxa = f(xa[0]) + xa[0]
i = 0

while abs(xa[i] - gxa) > 1e-6:
    gxa = xa[i]
    xa[i+1] = f(xa[i]) + xa[i]
    i = i + 1

ia=i+1
print('Iterations until convergence: ',i+1)

#Part ii
print("---Part(ii) Newton-Raphson---")
# Newton-Raphson
x0 = pi/4

x = zeros(100)
x[0]= x0
gx = x[0] - f(x[0])/df(x[0])
i = 0
while abs(x[i] - gx) > 1e-6:
    gx = x[i]
    x[i+1] = x[i]- f(x[i])/df(x[i])
    i = i + 1

print('Iterations until convergence: ',i+1)

#Part iii
print("---Part(iii) Plot---")

# plot the function
t = arange(-1, 2, 0.1)
yt = f(t)

pyplot.title(['Problem 1'])
pyplot.subplot(2,1,1)
pyplot.plot(t, yt, 'go')
pyplot.plot((-1, 1), (0, 0), 'r')
pyplot.grid(True)
```

```

pyplot.axis([-1, 1, -.5, .5])
pyplot.legend(['0.9*sin(x)-x', 'f(x)=0'])
pyplot.subplot(2,1,2)
pyplot.plot(range(0,i+1), x[0:i+1], 'b-')
pyplot.plot(range(0,ia), xa[0:ia], 'c-')
pyplot.grid(True)
pyplot.axis([0, 100, -.25, 1])
pyplot.legend(['Newton-Raphson', 'Iteration'])
pyplot.show()

```

*#Problem 5*

```
print("-----Problem 5-----")
```

*#Define the function*

```

f2 = lambda x: x**5 - 4.5*x**4 + 4.55*x**3 + 2.675*x**2 - 3.3*x - 1.4375
df2 = lambda x: 5*x**4 - 4*4.5*x**3 + 3*4.55*x**2 + 2*2.675*x - 3.3

```

*#Begin Algo*

```

x0 = -0.6;
x = zeros(100)
x[0]= x0
gx = x[0] - f2(x[0])/df2(x[0])
i = 0
while abs(x[i] - gx) > 1e-6:
    gx = x[i]
    x[i+1] = x[i] - f2(x[i])/df2(x[i])
    i = i + 1

print('Iterations until convergence: ', i+1)

```

*#M-K*

```

E = zeros(i+1)
for j in range(i+1):
    E[j]=abs(x[j]-x[j+1])

K = zeros(i-1)
for j in range(i-1):
    K[j]=(E[j+1]/E[j])

```

```

Kmin=min(K)
print('K ~ ', Kmin)
M=1/(1-Kmin)
print('M ~ ', M)

```

*#Plot*

```

# plot the function
t = arange(-1, 5, 0.1)
y2t = f2(t)

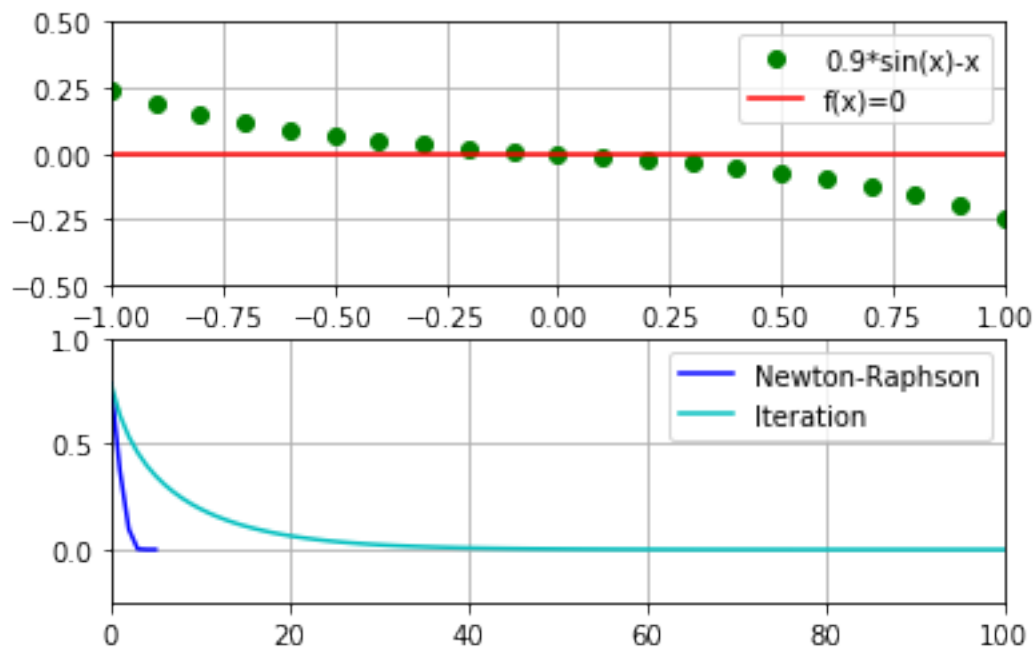
pyplot.title('Problem 2')
pyplot.plot(t, y2t, 'g-')
pyplot.plot((-5, 5), (0, 0), 'r')
pyplot.grid(True)
pyplot.axis([-2, 2, -1, 1])
pyplot.legend(['5*x^4 -4*4.5*x^3 +3*4.55*x^2 + 2*2.675*x -3.3', 'f(x)=0'])
pyplot.show()

```

```

-----Problem 4-----
---Part(i) Simple Iterations---
Iterations until convergence: 106
---Part(ii) Newton-Raphson---
Iterations until convergence: 6
---Part(iii) Plot---

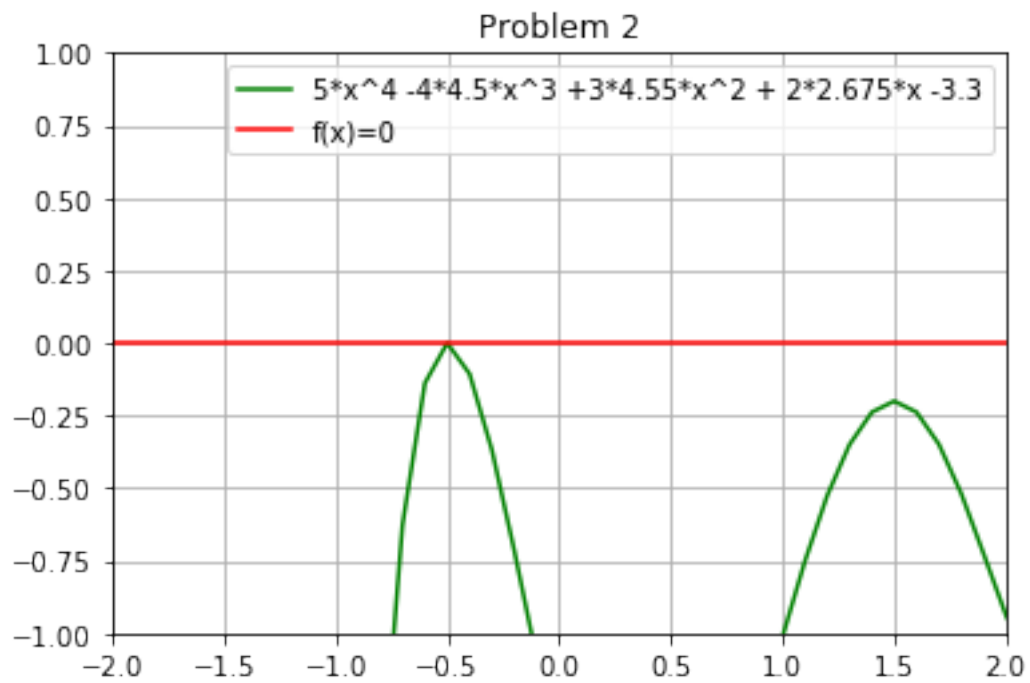
```



```

-----Problem 5-----
Iterations until convergence: 18
K ~ 0.5000022589142745
M ~ 2.0000090356979197

```



In [ ]: