

# HW1\_Deshmukh\_Rahul

September 12, 2017

## 1 Homework 1 by *Rahul Deshmukh*

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### Problem 1

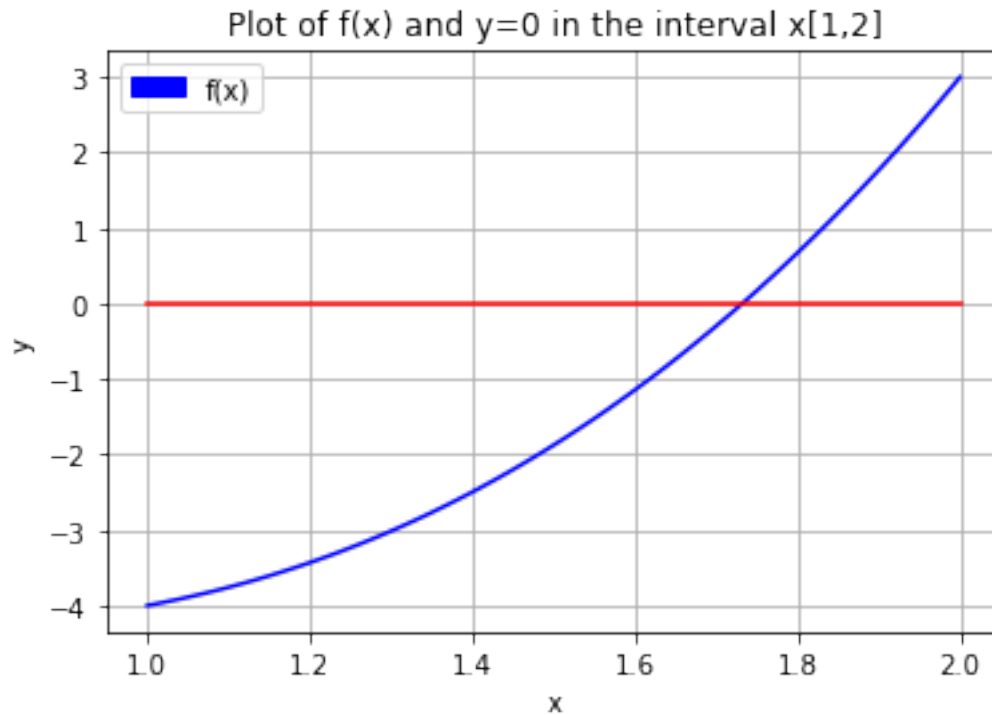
Given: Function  $f(x) = x^3 + x^2 - 3x - 3$

**Part 1:** Verify that  $f(x)$  has a solution in  $x \in [1, 2]$  by plotting the function

```
In [1]: import numpy as np
import matplotlib.pyplot as plt
import matplotlib.patches as mpatches
import math
a=1;b=2
x = np.linspace(a,b,101)
def f(x):
    return x**3 + x**2 -3*x - 3
#defining z so as to plot the line y=0
z = 0*x;

plt.plot(x,f(x),'b')
plt.plot(x,z,'r')
plt.xlabel('x')
plt.ylabel('y')
plt.grid(1)
legend_f = mpatches.Patch(color='blue', label='f(x)')
plt.legend(handles=[legend_f])
plt.title('Plot of f(x) and y=0 in the interval x[1,2]')
plt.show()

print('f({})= '.format(a)+str(f(a))+', f({})= '.format(b)+str(f(b))+
      ' and f({})*f({}) = '.format(a,b)+str(f(a)*f(b))+'\n')
if f(a)*f(b)<0:
    print('Then there exists a root in the interval [ {}, {} ]'.format(a,b))
```



$f(1) = -4$ ,  $f(2) = 3$  and  $f(1) \cdot f(2) = -12$

Then there exists a root in the interval  $[1, 2]$

As we can notice from the above plot the function  $f(x)$  intersects with  $y = 0$  at exactly one point in the interval  $x \in [1, 2]$ . Therefore there is a zero in this interval

**Part 2:** To Perform 5 iterations of the bisection method

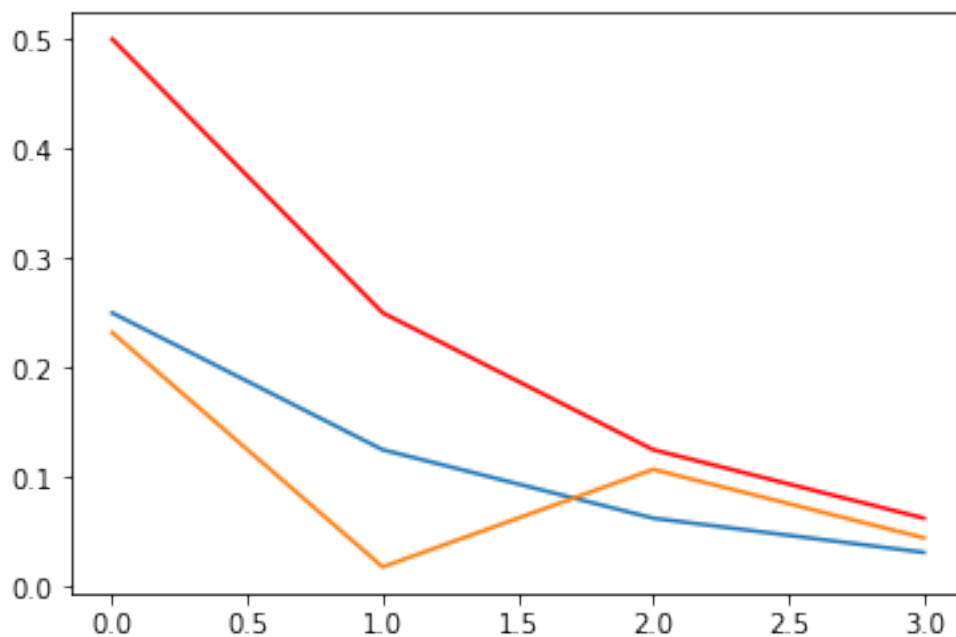
```
In [2]: N=5;tol=10^-9
p=np.zeros(N)
print('n\tpn          \tf(pn)\n')
for i in range (0,N):
    if f(p[i])==0 or (b-a)/2<tol:
        print('*** The root is {} with accuracy {}***'.format(p[i-1],tol))
        break
    p[i] = (a + b)/2
    if (f(p[i])*f(b))<0:
        a = p[i]
    else:
        b = p[i]
    print(str(i+1)+'\t{:0.9f}\t{:0.9f}\n'.format(p[i],f(p[i])))
if i == N-1:
    print('***We have reached the maximum number of {} iterations***\n'.format(N))
```

```
***We have reached the maximum number of 5 iterations***
```

```
In [3]: er = np.zeros(N)
        actual = np.zeros(N)
        th = np.zeros(N)
        root = 3**0.5
        a=1;b=2;
        for i in range(0,N-1):
            er[i] = np.abs(p[i+1]-p[i])
            actual[i] = np.abs(p[i]-root)
            th[i] = (b-a)/(2**(i+1))
        th[-1]=(b-a)/(2**N)
        #print(er)
        erp = np.zeros(N)
        actualp = np.zeros(N)
        for i in range(0,N-2):
            erp[i] = er[i+1]
        #print(erp)
        print('Table for iterative error vs theoretical error vs actual error\n\n')
        print('n\titerative error          \tttheoretical error\tactual error\n')
        for i in range(0,N):
            print(str(i+1)+'\t{:0.9f}                '.format(er[i])+'\t{:0.9f}                '.format(th[i])
                  +'\t{:0.9f}\n'.format(actual[i]))
        plt.plot(np.arange(N-1),er[:N-1])
        plt.plot(np.arange(N-1),th[:N-1], 'r')
        plt.plot(np.arange(N-1),actual[:N-1])
        plt.show()
```

n	iterative error	theoretical error	actual error
---	-----------------	-------------------	--------------

1	0.250000000	0.500000000	0.232050808
2	0.125000000	0.250000000	0.017949192
3	0.062500000	0.125000000	0.107050808
4	0.031250000	0.062500000	0.044550808
5	0.000000000	0.031250000	0.000000000

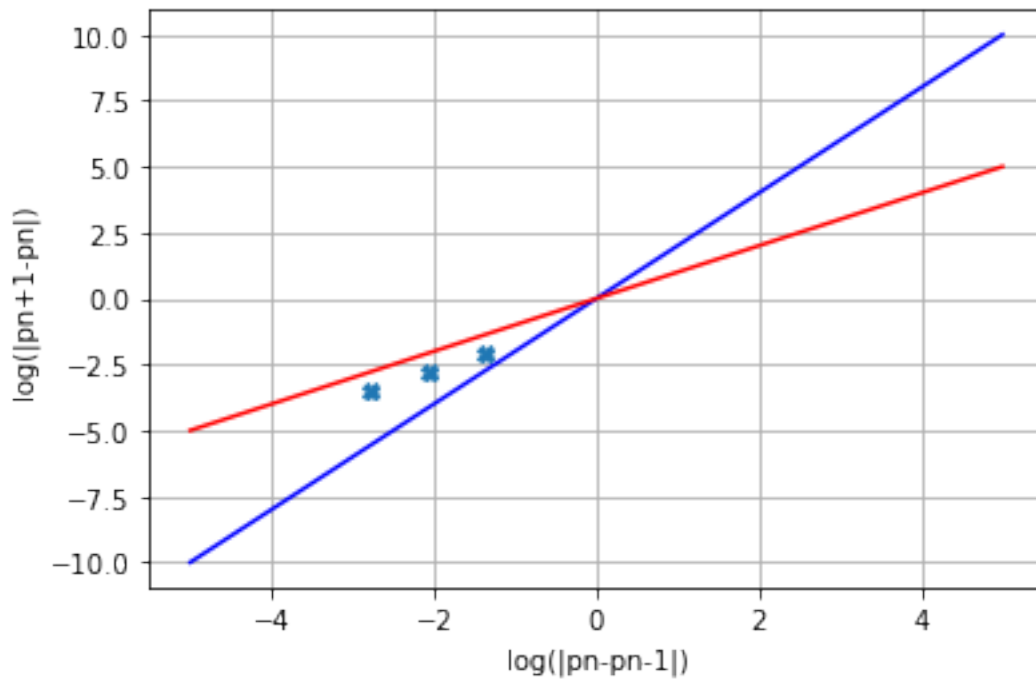


We can observe from the above table and the plot, that values of the *iterative error* and *actual error* are always **less than** the *theoretical error*(red) **but** the actual errors do not steadily decrease

```
In [4]: # Now plotting the log - log plot
t=np.linspace(-5,5,101)
plt.plot(t,2*t,'b') #for plotting y=2x
plt.plot(t,t,'r') #for plotting y=x
plt.plot(np.log(er),np.log(erp),'X')
plt.xlabel('log(|pn-pn-1|)')
plt.ylabel('log(|pn+1-pn|)')
plt.grid(1)
plt.show()
```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel\_launcher.py:5

"""



Therefore from the log-log plot we can say that the bisection method has a **linear** error (as the points are along  $y=x$  (red line))

---

### Problem 2

Given: Function  $f(x) = x^6 - 3$

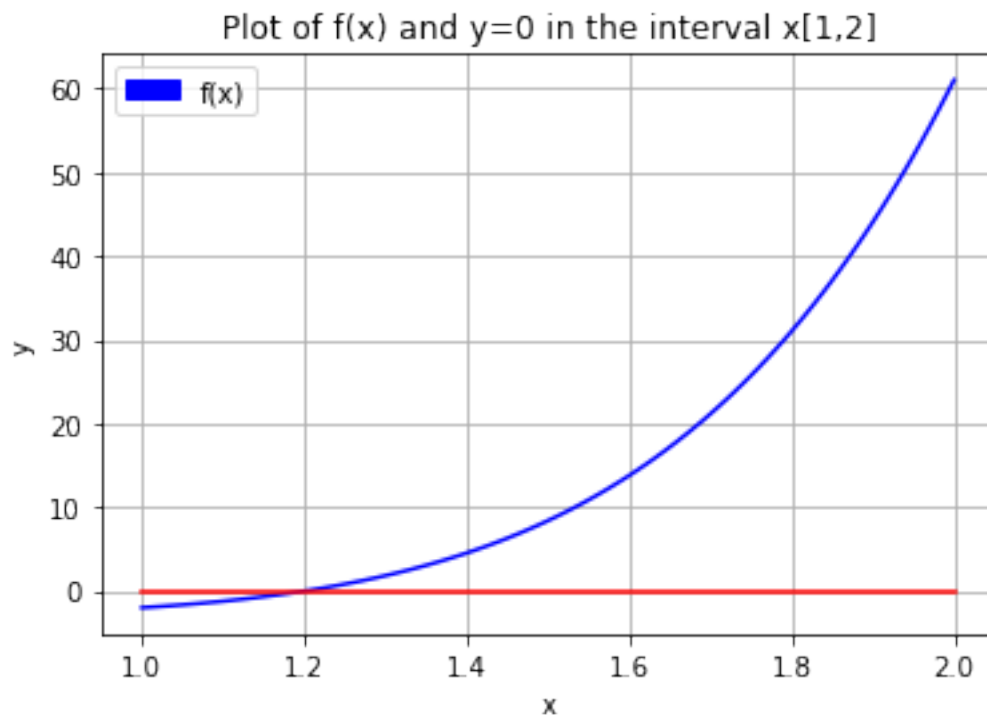
**Part 1:** Verify that  $f(x)$  has a solution in  $x \in [1, 2]$

```
In [5]: a=1;b=2
        x = np.linspace(a,b,101)
        def f(x):
            return x**6- 3
        #defining z so as to plot the line y=0
        z = 0*x;

        plt.plot(x,f(x), 'b')
        plt.plot(x,z, 'r')
        plt.xlabel('x')
        plt.ylabel('y')
        plt.grid(1)
        legend_f = mpatches.Patch(color='blue', label='f(x)')
        plt.legend(handles=[legend_f])
```

```
plt.title('Plot of f(x) and y=0 in the interval x[1,2]')
plt.show()

print('f({})= '.format(a)+str(f(a))+', f({})= '.format(b)+str(f(b))+
      ' and f({})*f({}) = '.format(a,b)+str(f(a)*f(b))+ ' < 0\n')
if f(a)*f(b)<0:
    print('Then there exists a root in the interval [{} , {}]'.format(a,b))
```



$f(1) = -2$ ,  $f(2) = 61$  and  $f(1)*f(2) = -122 < 0$

Then there exists a root in the interval  $[1,2]$

```
In [6]: N=5;tol=10^-9
p=np.zeros(N)
print('n\tpn          \tf(pn)\n')
for i in range (0,N):
    if f(p[i])==0 or (b-a)/2<tol:
        print('*** The root is {} with accuracy {}***'.format(p[i-1],tol))
        break
    p[i] = (a + b)/2
    if (f(p[i])*f(b))<0:
        a = p[i]
    else:
```

```

        b = p[i]
        print(str(i+1)+'\t{:0.9f}\t{:0.9f}\n'.format(p[i],f(p[i])))
    if i == N-1:
        print('***We have reached the maximum number of {} iterations***\n'.format(N))

```

n	pn	f(pn)
1	1.500000000	8.390625000
2	1.250000000	0.814697266
3	1.125000000	-0.972713470
4	1.187500000	-0.195846975
5	1.218750000	0.277085499

\*\*\*We have reached the maximum number of 5 iterations\*\*\*

### Verifying the error bound

```

In [7]: er = np.zeros(N)
        th=np.zeros(N)
        a = 1;b=2;
        for i in range(0,N-1):
            er[i] = np.abs(p[i+1]-p[i])
            actual[i] = np.abs(p[i]-root)
            th[i]=(b-a)/(2**i)
        #print(er)
        th[-1]=(b-a)/(2**N)
        erp = np.zeros(N)
        for i in range(0,N-2):
            erp[i] = er[i+1]
        #print(erp)
        print('Table for iterative error vs theoretical error\n\n')
        print('\n\titerative error      \t\ttheoretical error\n')
        for i in range(0,N):
            print(str(i+1)+'\t{:0.9f}          '.format(er[i])+'\t{:0.9f}\n'.format(th[i]))

        #plt.plot(np.arange(N-1),er[:N-1])
        #plt.plot(np.arange(N-1),th[:N-1], 'r')
        plt.show()

```

Table for iterative error vs theoretical error

n	iterative error	theoretical error
1	0.250000000	1.000000000
2	0.125000000	0.500000000
3	0.062500000	0.250000000
4	0.031250000	0.125000000
5	0.000000000	0.031250000

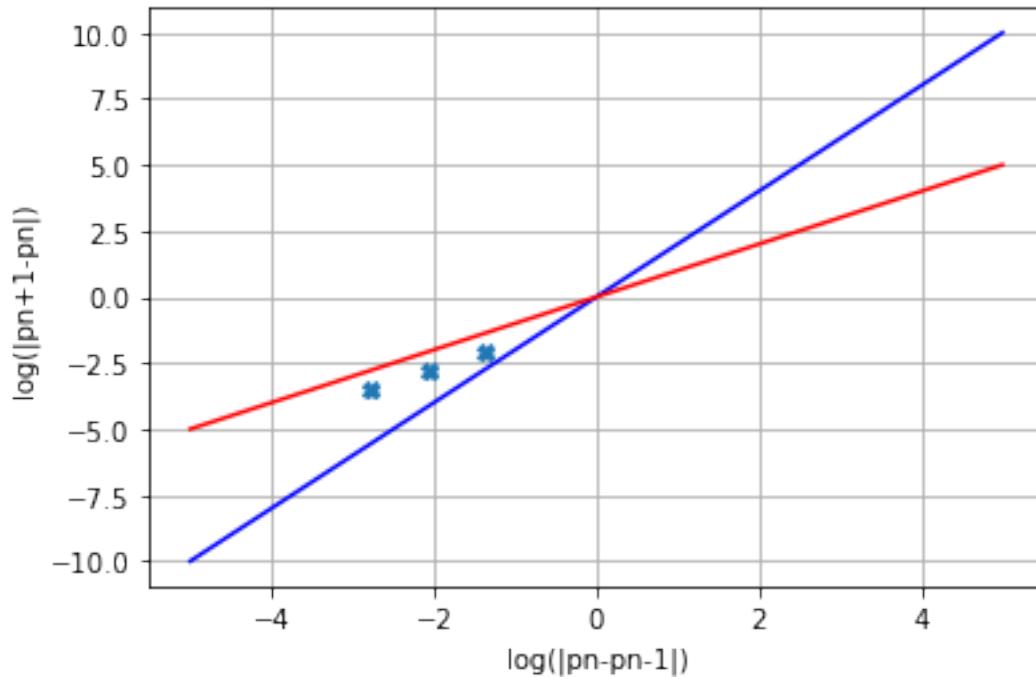
We can observe from the above table that values of the *Iterative error* are always **less than** the *Theoretical error*

```
In [8]: # Now plotting the log - log plot
t=np.linspace(-5,5,101)
plt.plot(t,2*t,'b') #for plotting y=2x
plt.plot(t,t,'r') #for plotting y=x
plt.plot(np.log(er),np.log(erp),'X')
plt.plot(np.log(actual),np.log(actualp),'*')
plt.xlabel('log(|pn-pn-1|)')
plt.ylabel('log(|pn+1-pn|)')
plt.grid(1)
plt.show()
```

```
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:5
"""
```

```
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:6
```





Therefore from the log-log plot we can say that the bisection method has a **linear** (as it is along  $y=x$  (red line)) error theoretically

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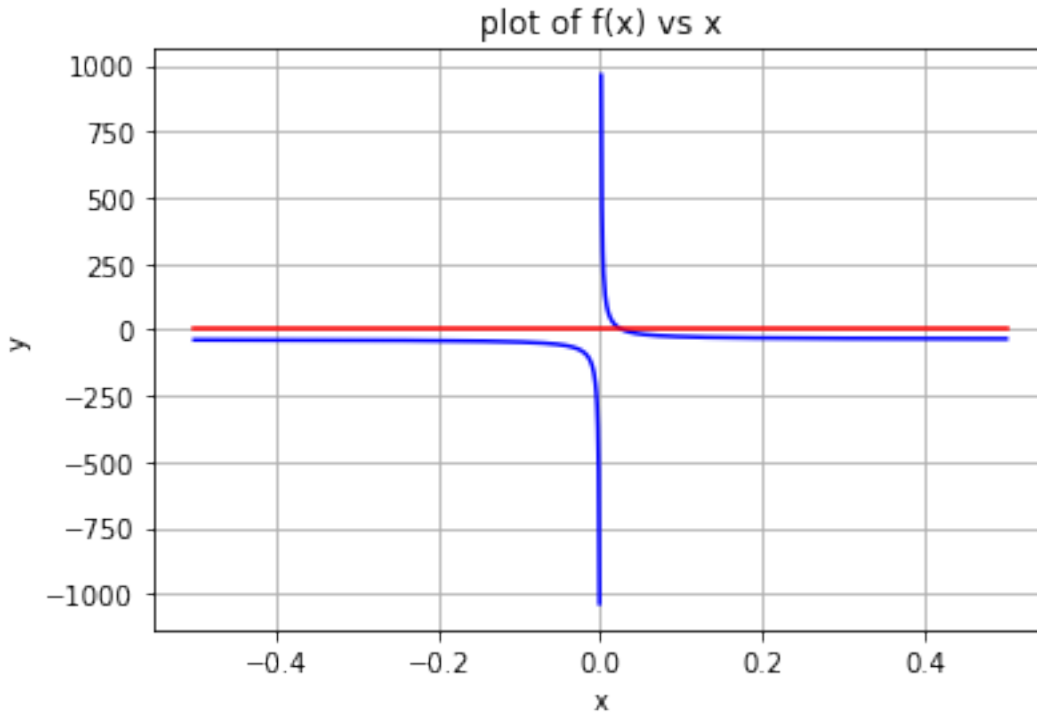
### Problem 3

To find value of  $\frac{1}{37}$  to the order of five decimal places using bisection method for  $f(x) = \frac{1}{x} - 37 = 0$

```
In [9]: x= np.linspace(-0.5,0.5,1001)
def f(x):
    return x**-1-37
z = 0*x
plt.plot(x,f(x),'b')
plt.plot(x,z,'r')
plt.title('plot of f(x) vs x')
plt.ylabel('y')
plt.xlabel('x')
plt.grid(1)
plt.show()
```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel\_launcher.py:3

This is separate from the ipykernel package so we can avoid doing imports until



We know that the function  $f(x)$  has a root at  $x = \frac{1}{37}$ . Also, From the above plot we can say that the function  $f(x)$  will have a **positive value** for  $0 < x < \frac{1}{37}$  and a **negative value** for  $x > \frac{1}{37}$

```
In [10]: #estimating value for a & b
a0 = 1/50;b0=1/2;tol=10**-5
print('f({})= '.format(a0)+str(f(a0))+', f({})= '.format(b0)+str(f(b0))+
      ' and f({})*f({}) = '
      .format(a0,b0)+str(f(a0)*f(b0))+ ' < 0\n')
if f(a0)*f(b0)<0:
    print('Then there exists a root in the interval [{} , {}]'.format(a0,b0))
```

$f(0.02) = 13.0$ ,  $f(0.5) = -35.0$  and  $f(0.02)*f(0.5) = -455.0 < 0$

Then there exists a root in the interval  $[0.02, 0.5]$

We need to find an estimate value of the root upto 5 decimal points which means  $tolerance(\delta) = 10^{-5}$ .

```
In [11]: N=40
a=a0;b=b0;
p=np.zeros(N)
print('\n\tpn          \tf(pn)\n')
for i in range (0,N):
    if f(p[i])==0 or ((b-a)/2)<tol:
```

```

    #if f(p[i])==0:
        print('*** The root is {:.5f} with accuracy {}***'.format(p[i-1],tol))
        count = i-1
        break
    p[i] = (a + b)/2
    if (f(p[i])*f(b))<0:
        a = p[i]
    else:
        b = p[i]
    print(str(i+1)+'\t{:.5f} \t{:.5f}\n'.format(p[i],f(p[i])))
    count = i-1

if i == N-1:
    print('***We have reached the maximum number of {} iterations***\n'.format(N))
er = np.zeros(N)
for i in range(0,count):
    er[i] = abs(p[i+1]-p[i])
plt.plot(np.arange(count),p[:count])
plt.grid(1)
plt.xlabel('Iteration number (N)')
plt.ylabel('approximate root')
plt.title('Plot of Approximate Root vs Iteration Number')
plt.show()

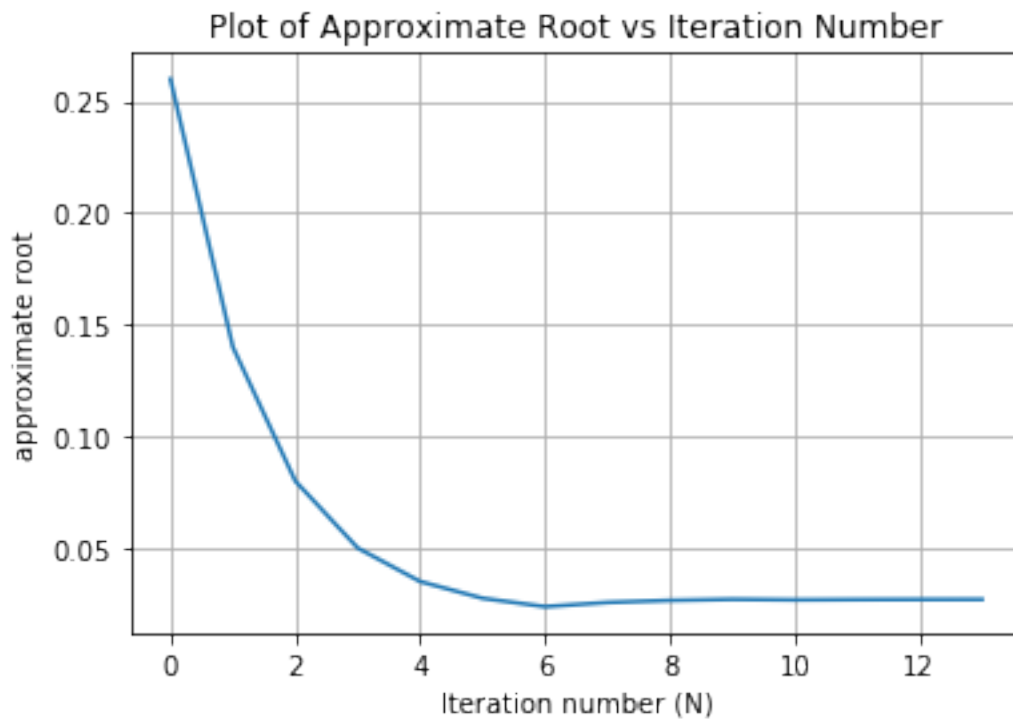
```

n	pn	f(pn)
1	0.26000	-33.15385
2	0.14000	-29.85714
3	0.08000	-24.50000
4	0.05000	-17.00000
5	0.03500	-8.42857
6	0.02750	-0.63636
7	0.02375	5.10526
8	0.02563	2.02439
9	0.02656	0.64706
10	0.02703	-0.00578
11	0.02680	0.31778

12	0.02691	0.15530
13	0.02697	0.07458
14	0.02700	0.03436
15	0.02702	0.01428

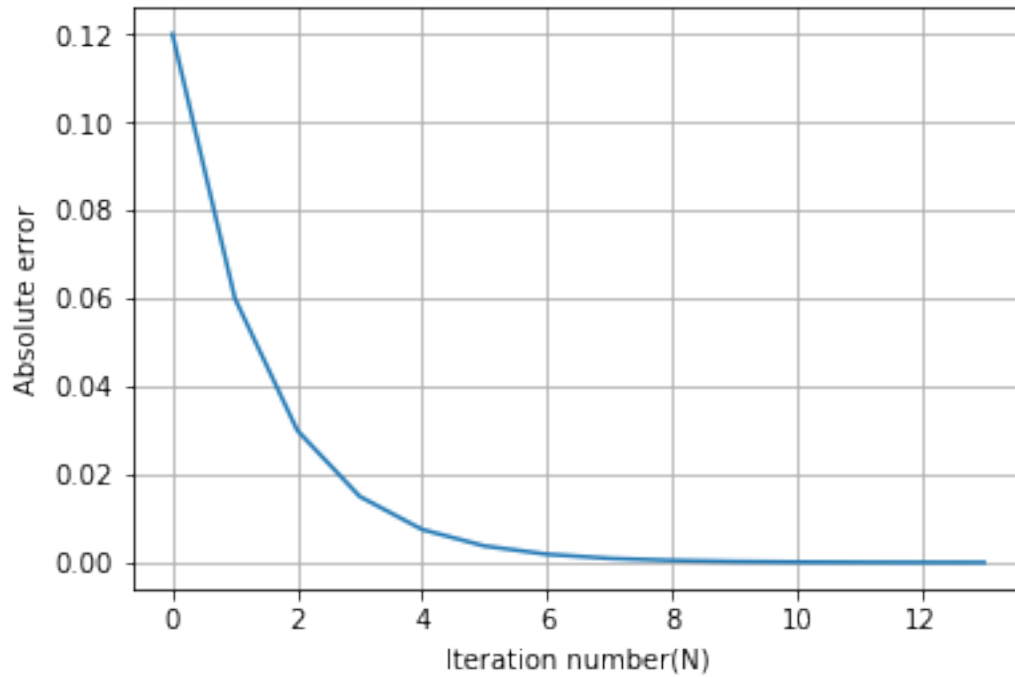
\*\*\* The root is 0.02702 with accuracy 1e-05\*\*\*

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel\_launcher.py:3  
This is separate from the ipykernel package so we can avoid doing imports until



Plot of Absolute error vs Iteration number

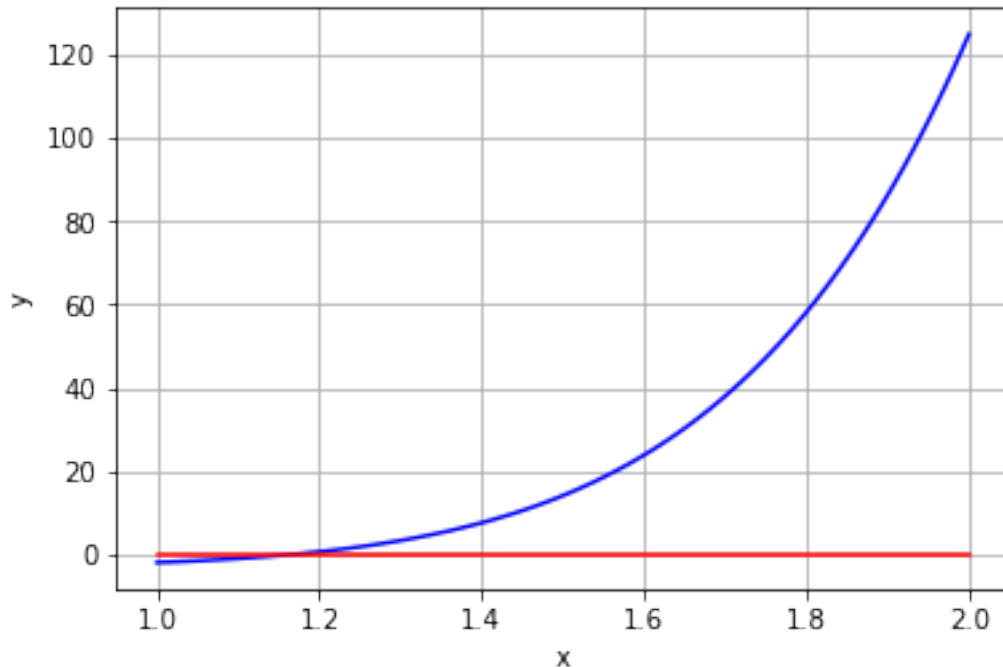
```
In [12]: plt.plot(np.arange(count), er[:count])
          plt.xlabel('Iteration number(N)')
          plt.ylabel('Absolute error')
          plt.grid(1)
          plt.show()
```



#### Problem 4

To find the root of  $f(x) = x^7 - 3 \forall x \in [1, 2]$

```
In [13]: x = np.linspace(1,2,101)
def f(x):
    return x**7-3
def df(x):
    return 7*(x**6)
z = 0*x
plt.plot(x,f(x),'b')
plt.plot(x,z,'r')
plt.xlabel('x')
plt.ylabel('y')
plt.grid(1)
plt.show()
```



Performing 5 iterations of newtons method with initial guess as  $p_0 = 1.6$

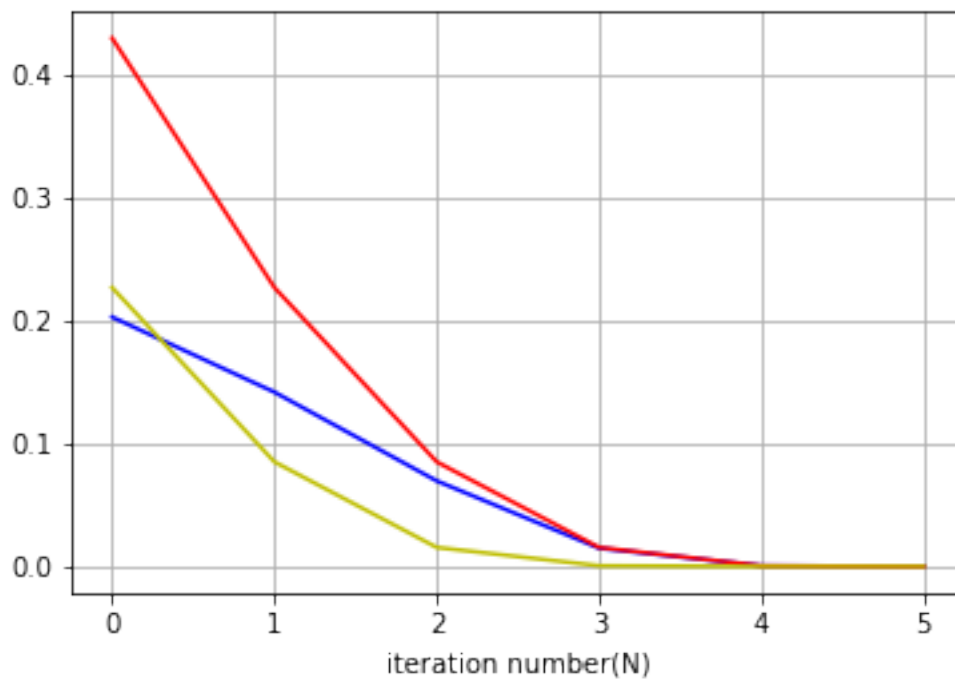
```
In [14]: N = 6
p = np.zeros(N)
root = 3**(1/7)
#taking initial guess of the root as 1.6
p[0]=1.6
for i in range(0,N-1):
    p[i+1]= p[i] - f(p[i])/df(p[i])
print(p)

[ 1.6          1.39697342  1.25506841  1.18542549  1.17052534  1.16993172]
```

```
In [15]: er = np.zeros(N)
er2 = np.zeros(N)
er3 = np.zeros(N)
print('n\tpn\t|pn-pn-1|\t|pn-1-p|\t|pn-p|\n')
for i in range(0,N-1):
    er[i]=np.abs(p[i+1]-p[i])
    er2[i]=np.abs(p[i]-root)
    er3[i]=np.abs(p[i+1]-root)
    print(str(i+1)+'\t'+str(p[i])+'\t'+str(er[i])+'\t'+str(er2[i])+
          '\t'+str(er3[i])+'\n')
plt.plot(np.arange(N),er,'b')
plt.plot(np.arange(N),er2,'r')
```

```
plt.plot(np.arange(N),er3,'y')
plt.xlabel('iteration number(N)')
plt.grid(1)
plt.show()
```

n	pn	pn-pn-1	pn-1-p	pn-p
1	1.6	0.203026580811	0.430069187241	0.227042606431
2	1.39697341919	0.141905013016	0.227042606431	0.0851375934151
3	1.25506840617	0.0696429124585	0.0851375934151	0.0154946809566
4	1.18542549372	0.0149001533702	0.0154946809566	0.000594527586381
5	1.17052534035	0.000593622444113	0.000594527586381	9.05142268914e-0



The above plot indicates that the iterative error  $|p_n - p_{n-1}|$  (blue) lies between the actual errors  $|p_n - p|$  (yellow) and  $|p_{n-1} - p|$  (red) and all converging together to 0

```
In [16]: ratio = np.zeros(len(er))

for i in range(0,len(er)):
    #ratio[i] = np.abs(p[i+1]-root)/(np.abs(p[i]-root))**2
```

```

        ratio[i]= er3[i]/(er2[i])**2
    print('ratio is {}'.format(ratio))
    def ddf(x):
        return 42*x**5
    a=np.abs(ddf(root)/(2*df(root)))
    print(a)

```

```

ratio is [ 1.22752602  1.65160672  2.13766624  2.47631982  2.56078327          nan]
2.56425419972

```

```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:5
"""

```

From the above calculation it is clear that the ratio  $\frac{|p_n - p|}{|p_{n-1} - p|^2} \rightarrow |f''(p)/2f'(p)|$

### Problem 5

We need to find **all** the roots of the functions (using newtons method):  $f_1(x) = e^x + x^2 - x - 4$ ,  $f_2(x) = x^3 - x^2 - 10x + 7$ ,  $f_3(x) = 1.05 - 1.04x + \ln(x)$  with tolerance( $\delta$ ) =  $10^{-6}$

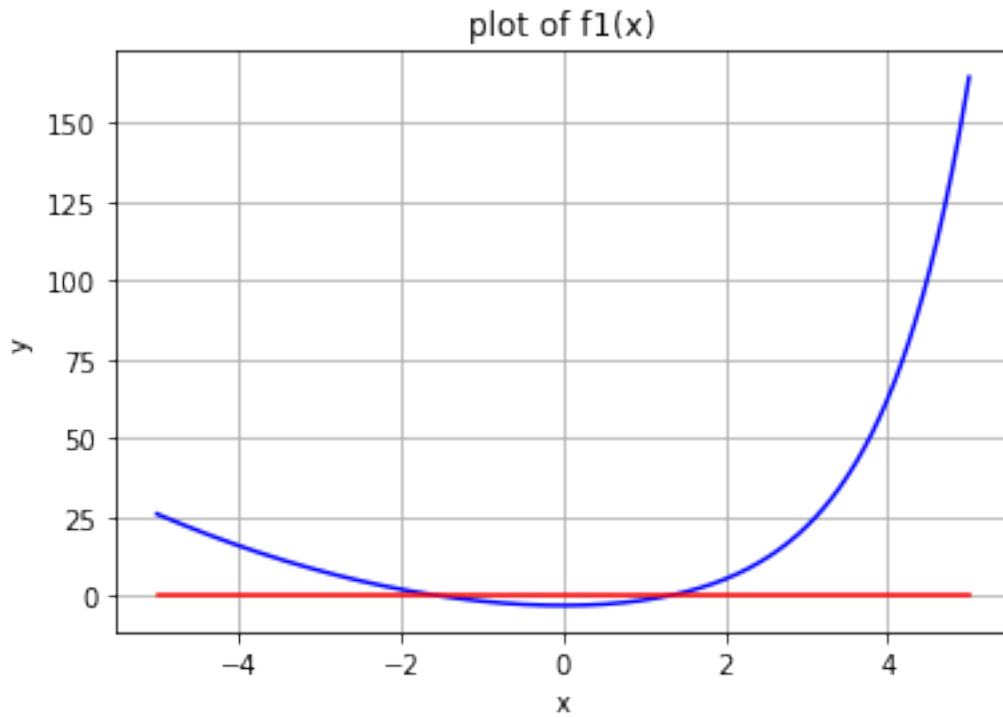
First lets plot the functions to find out the number of roots

```

In [17]: x = np.linspace(-5,5,1001)
        tol = 10**-6
        def f1(x):
            return (np.e)**x+x**2-x-4
        def f2(x):
            return x**3-x**2-10*x+7
        def f3(x):
            return 1.05-1.04*x+np.log(x)
        z=0*x
        plt.plot(x,f1(x), 'b')
        plt.plot(x,z, 'r')
        plt.xlabel('x')
        plt.ylabel('y')
        plt.grid(1)
        plt.title('plot of f1(x)')
        plt.show()

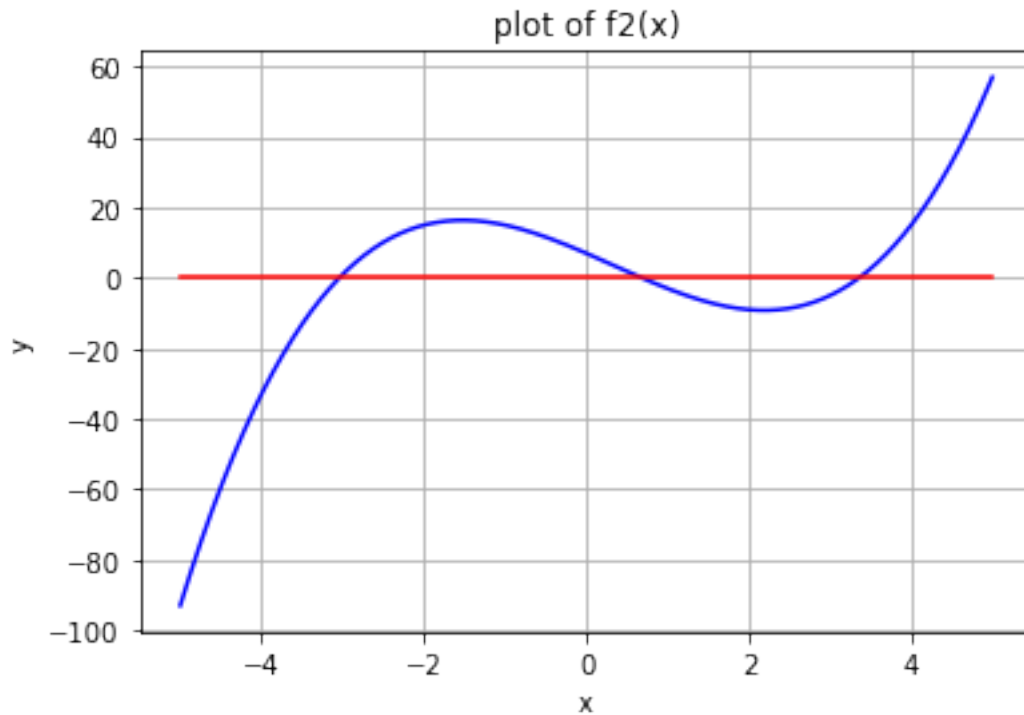
```





We can observe that  $f_1(x)$  has 02 roots and we can take the initial guess as -4 and +4 for the two roots

```
In [18]: plt.plot(x,f2(x),'b')
plt.plot(x,z,'r')
plt.xlabel('x')
plt.ylabel('y')
plt.grid(1)
plt.title('plot of f2(x)')
plt.show()
```

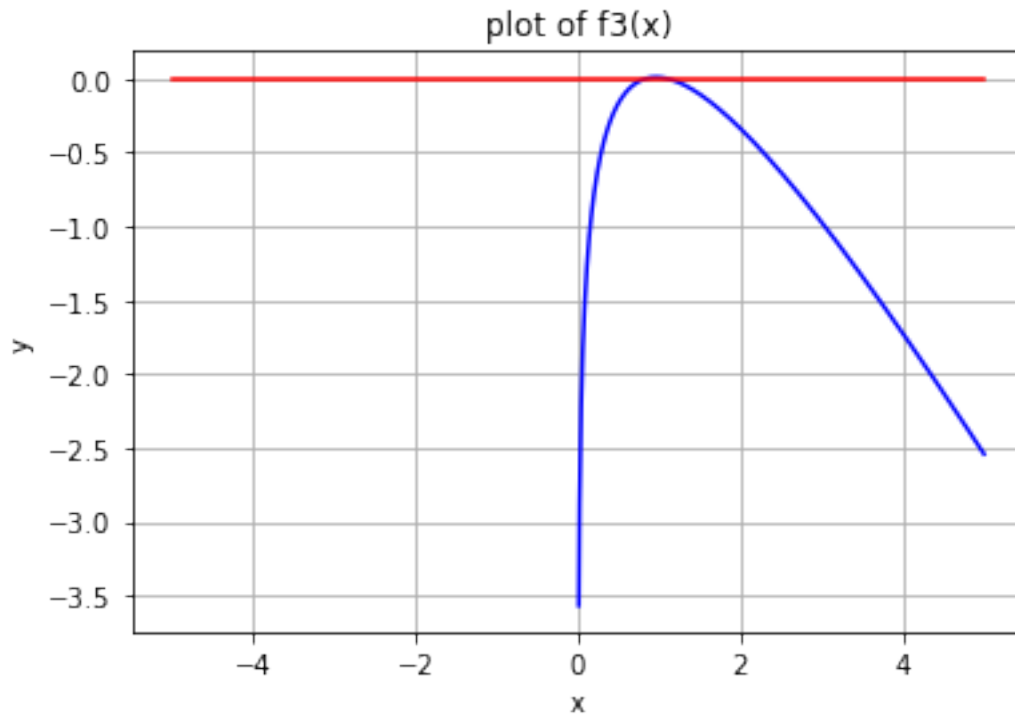


We can observe that  $f_2(x)$  has 03 roots and we can take the initial guesses as -4, 0 & +4 for the roots

```
In [19]: plt.plot(x,f3(x),'b')
          plt.plot(x,z,'r')
          plt.xlabel('x')
          plt.ylabel('y')
          plt.title('plot of f3(x)')
          plt.grid(1)
          plt.show()
```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel\_launcher.py:8

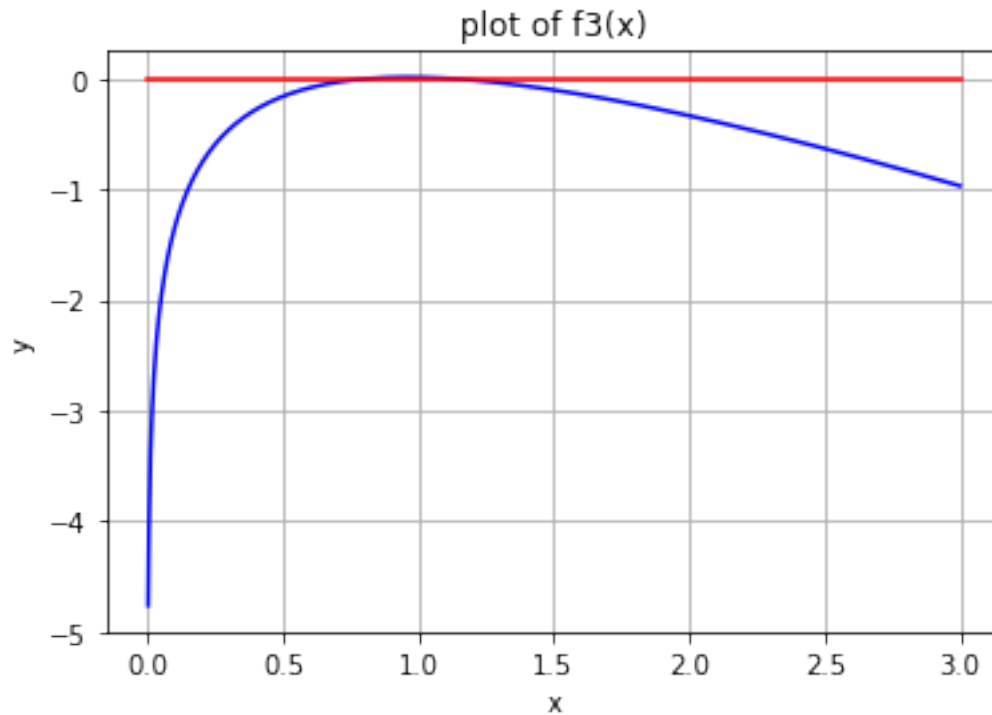
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel\_launcher.py:8



from the above plot its not clear that the function  $f_3(x)$  has 02 or 01 roots we can plot the funtion again with a new bound for x

```
In [20]: t = np.linspace(0,3,1001)
         z = 0*t
         plt.plot(t,f3(t),'b')
         plt.plot(t,z,'r')
         plt.xlabel('x')
         plt.ylabel('y')
         plt.title('plot of f3(x)')
         plt.grid(1)
         plt.show()
```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel\_launcher.py:8



Again, there are either **02** or **01** roots, we will have to evaluate the value of  $f_3(1)$  and check its sign

```
In [21]: print(f3(1))
```

```
0.01
```

as we can see that the value of  $f_3(1)$  is positive therefore there are two roots and we can take the initial guesses for the newtons method as **+0.25** and **+3** solving for  $f_1(x)$ :

```
In [22]: def df1(x):
          return (np.e)**x+2*x-1

def newton(ini,N,f,df,tol):
    r=np.zeros(len(ini))
    for k in range(0,len(ini)):
        p = [0]
        p[0]=ini[k]
        i=0
        while 1 or i<=N:
            p.append(p[i] - f(p[i])/df(p[i]))
            if np.abs((p[i+1]-p[i]))<=tol:
                count = i
```

```

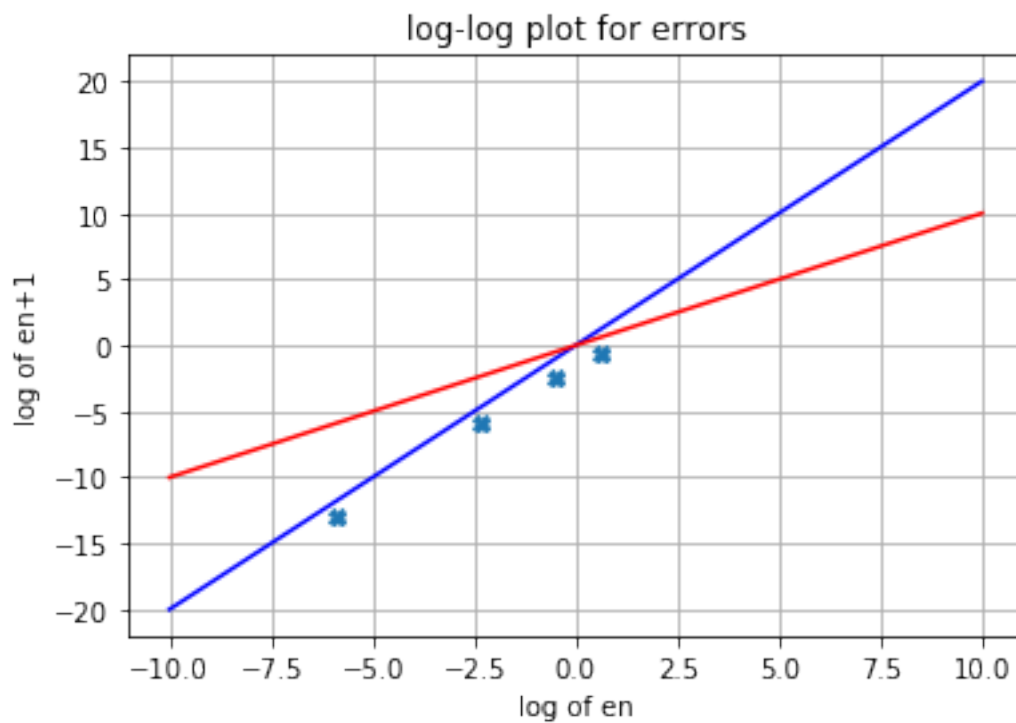
        print('***The approximate root is '+str(p[i])+' with tolerance '
              +str(tol)+'***\n')
        break
    i = i+1
    if i==N:
        count = i
        print('!! We have reached the maximum number of iterations'+
              ' and cannot meet the tolerance, the last approximate root was '+
              str(p[-1])+'\n')
    er = np.zeros(count)
    for j in range(0,count):
        er[j]=np.abs(p[j+1]-p[j])
    erp =np.zeros(count)
    for j in range(0,count-1):
        erp[j] = er[j+1]
    plt.plot(np.log(er),np.log(erp), 'X')
    t=np.linspace(-10,10,101) #for plotting y=2x
    plt.plot(t,2*t, 'b')
    plt.plot(t,t, 'r')
    plt.plot()
    plt.xlabel('log of en')
    plt.ylabel('log of en+1')
    plt.title('log-log plot for errors')
    plt.grid(1)
    plt.show()
    r[k]=p[-1]
    return(r)

# initial guesses for f1(x) were -4 and +4
f1_ini =[-4,4]
root1 = newton(f1_ini,100,f1,df1,tol)
print('All the roots of f1(x) are'+str(root1))
#print('x='+str(root1)+'is one root of f1 with f1(x)='+str(f1(root1))+'\n')

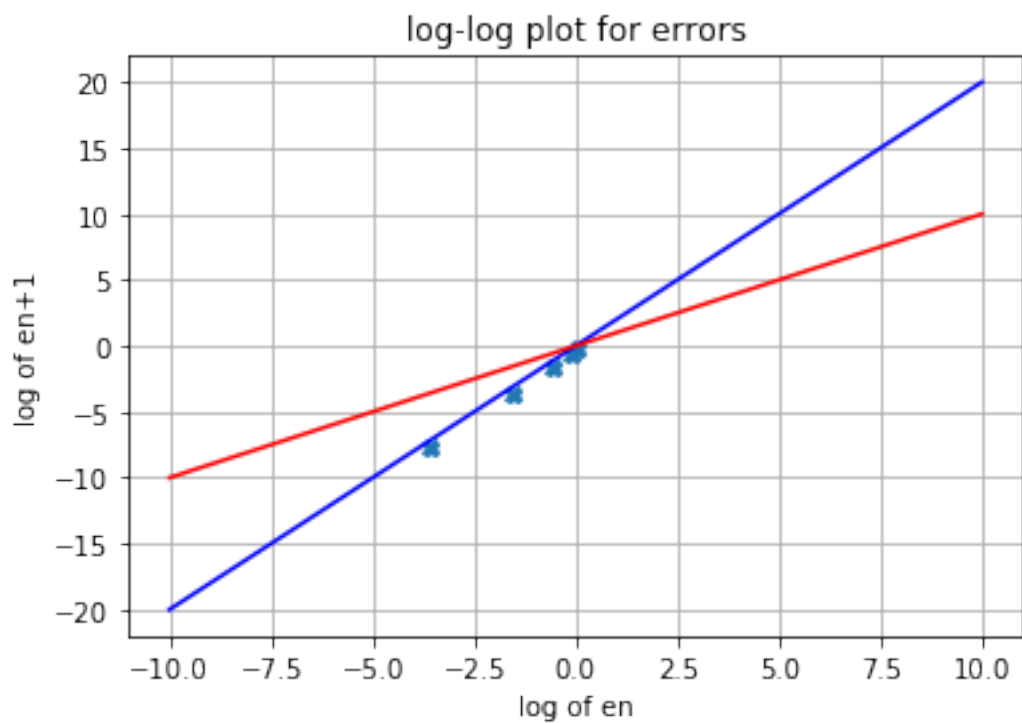
```

\*\*\*The approximate root is -1.5070994840769143 with tolerance 1e-06\*\*\*

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel\_launcher.py:3



\*\*\*The approximate root is 1.2886780624119591 with tolerance 1e-06\*\*\*



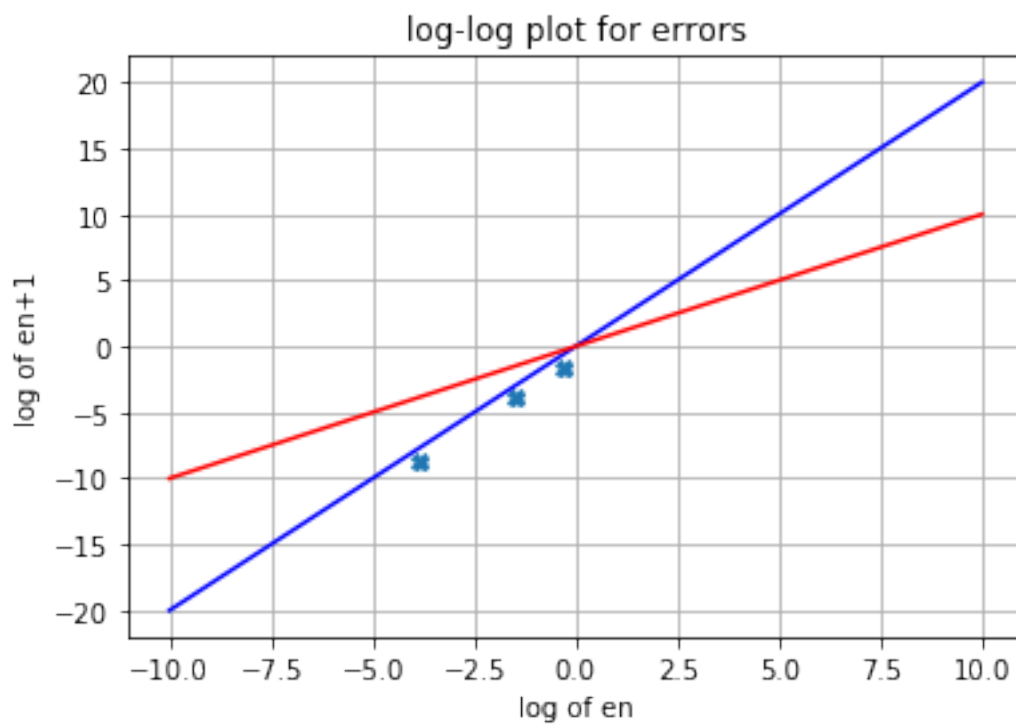
All the roots of  $f_1(x)$  are `[-1.50709948 1.28867797]`

Solving for  $f_2(x)$  with initial guess as **-4,0,+4**

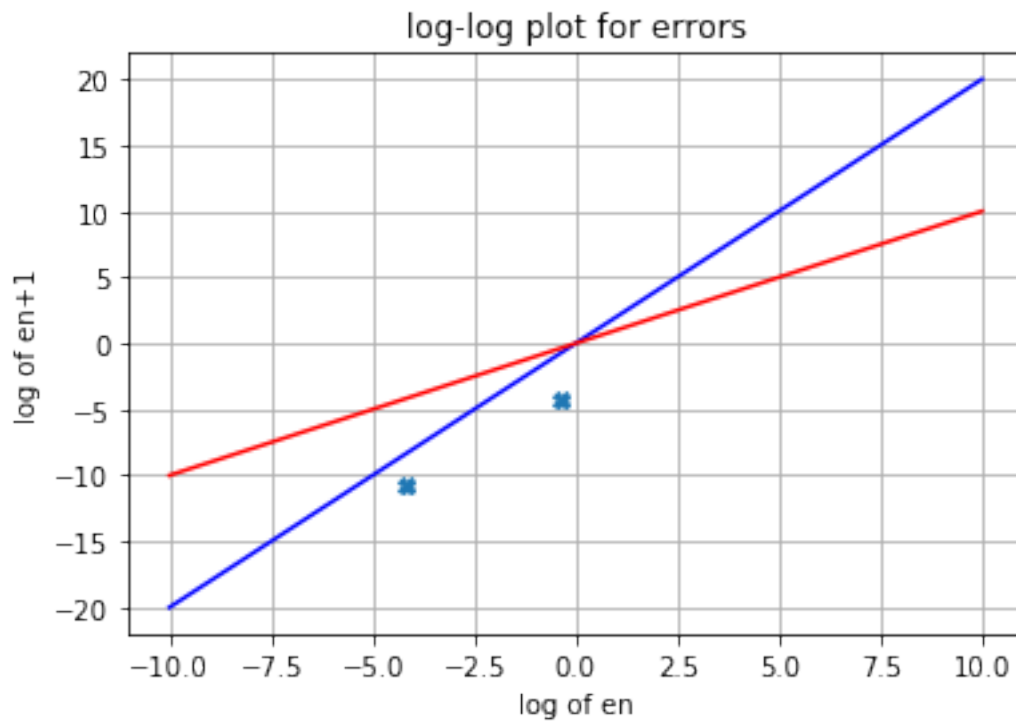
```
In [23]: def df2(x):  
         return 3*x**2-2*x-10  
         f2_ini =[-4,0,4]  
         root1 = newton(f2_ini,100,f2,df2,tol)  
         print('All the roots of f2(x) are'+str(root1))
```

\*\*\*The approximate root is -3.042682799149429 with tolerance 1e-06\*\*\*

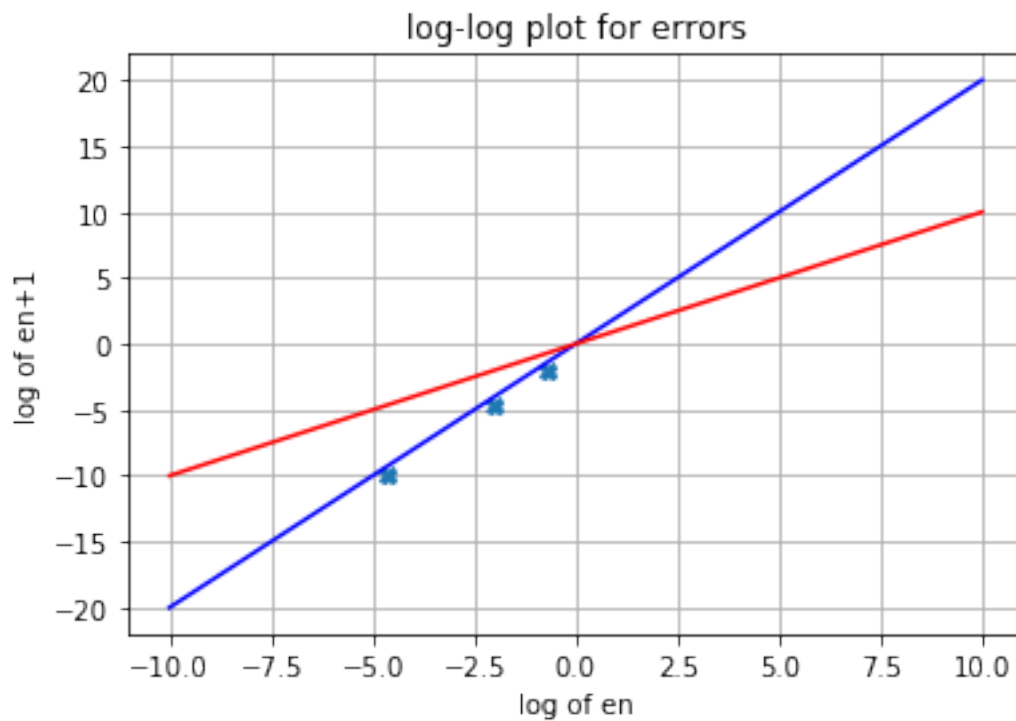
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel\_launcher.py:3



\*\*\*The approximate root is 0.6852202473404514 with tolerance 1e-06\*\*\*



\*\*\*The approximate root is 3.3574625381598624 with tolerance 1e-06\*\*\*





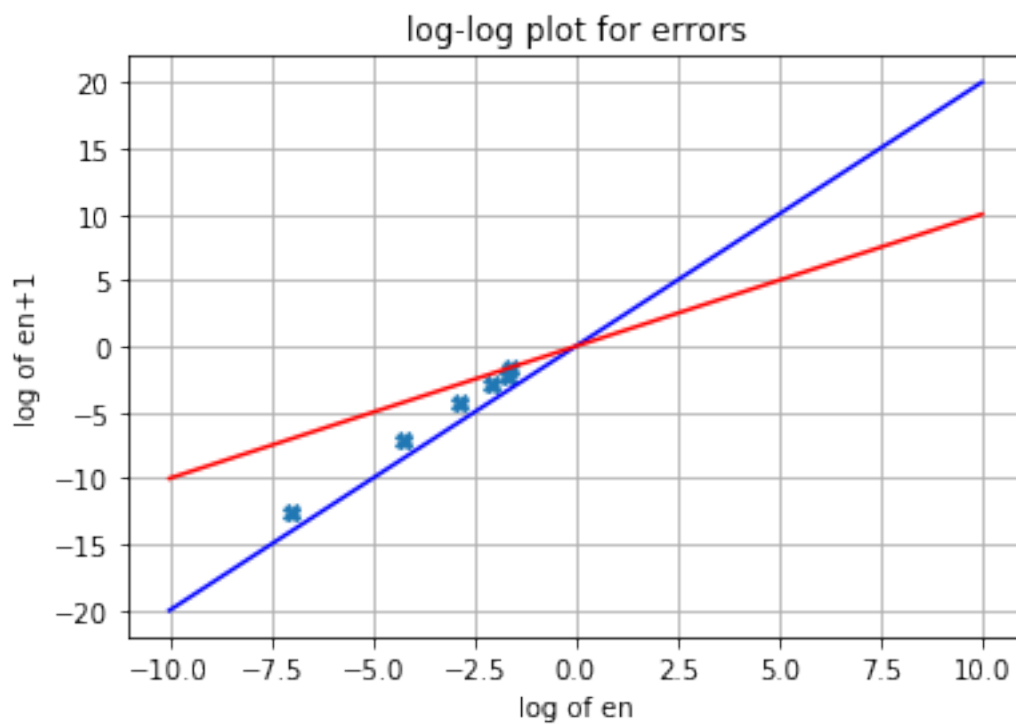
All the roots of  $f_2(x)$  are `[-3.04268278 0.68522025 3.35746254]`

Solving for  $f_3(x)$  with initial guesses `+0.25` and `+3`

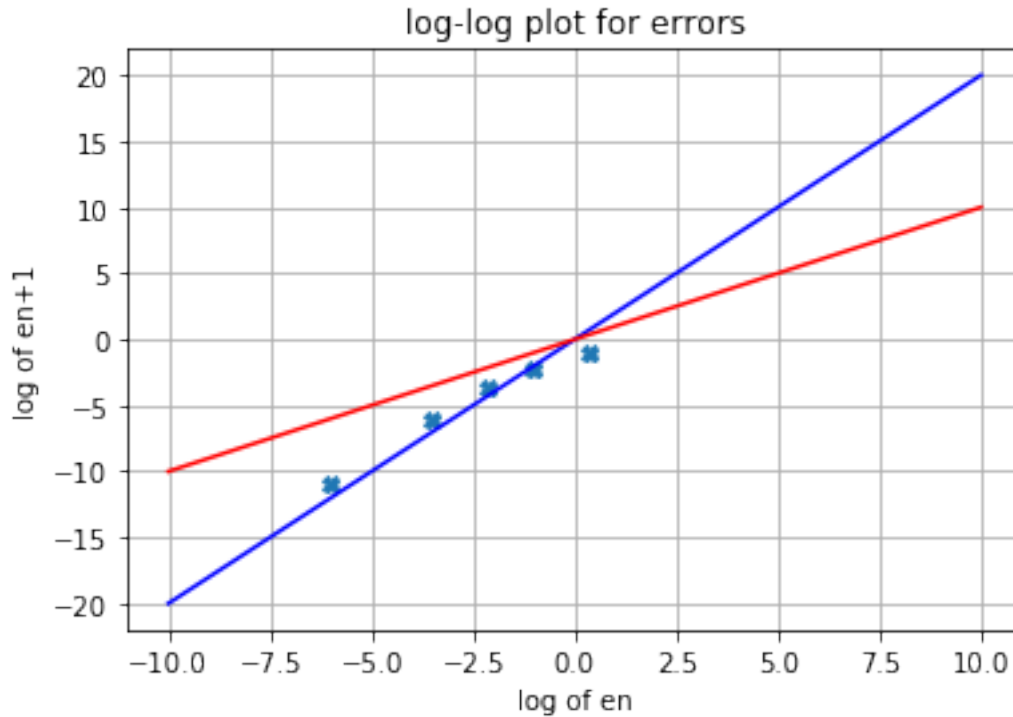
```
In [24]: def df3(x):  
         return -1.04+(1/x)  
         f3_ini =[+0.25,3]  
         root1 = newton(f3_ini,100,f3,df3,tol)  
         print('All the roots of f2(x) are'+str(root1))
```

\*\*\*The approximate root is 0.827180908455 with tolerance 1e-06\*\*\*

`/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:3`



\*\*\*The approximate root is 1.1097123047 with tolerance 1e-06\*\*\*



All the roots of  $f_2(x)$  are [ 0.82718091 1.1097123 ]

As the log-log plots of the errors are along the blue line which is  $y = 2x$ . Therefore, We can say that the Newtons method converges Quadratically

#### Problem 6:

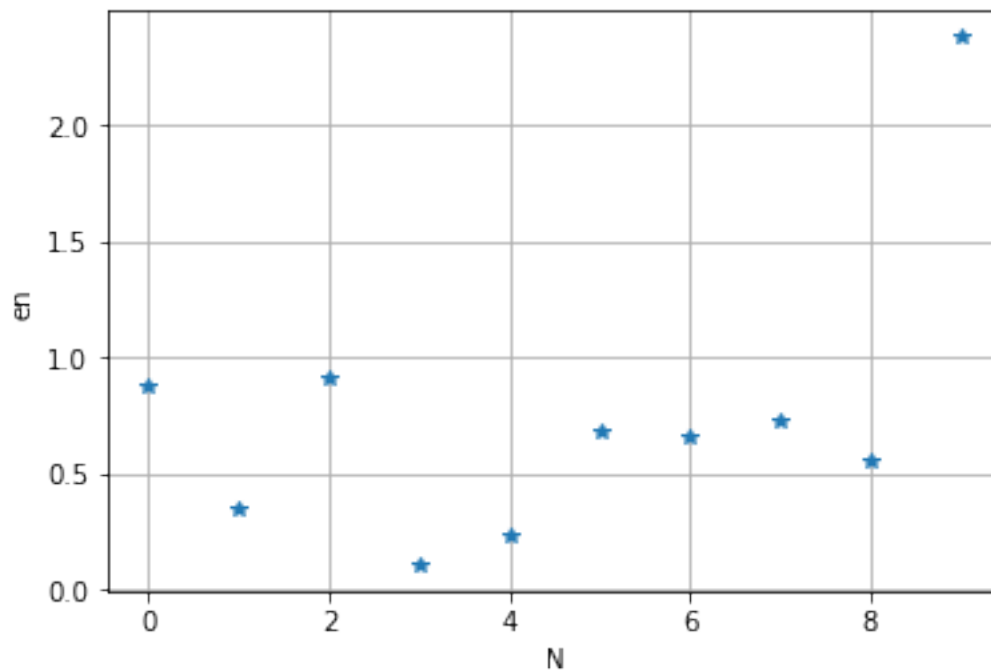
We need to find the root for  $f(x) = 3x(1 - \cos(\pi x))$  with initial guess  $p_0 = 0.5$  and need to comment on the order of convergence

```
In [25]: x= np.linspace(0,1,101)
def f(x):
    return 3*x*(1-np.cos(np.pi*x))
def df(x):
    return 3*(1-np.cos(np.pi*x))-3*x*(np.pi*(np.sin(np.pi*x)))
def g(p,f,df,N):
    q=np.zeros(N+1)
    er = np.zeros(N+1)
    erp = np.zeros(N+1)
    q[0]=p
    for i in range(0,N):
        q[i+1]=q[i]-f(q[i])/(df(q[i]))
```

```

for i in range(0,N):
    er[i]=np.abs(q[i+1]-q[i])
for i in range(0,N):
    erp[i]=er[i+1]
plt.plot(range(0,N),er[:N], '*')
#plt.plot(np.log(er),np.log(erp), 'X')
plt.xlabel('N')
plt.ylabel('en')
plt.grid(1)
plt.show()
print('the iterative error is')
print(er[:-1])
return(q)
p0=0.5
root = g(p0,f,df,10)

```



the iterative error is

```

[ 0.8759692  0.35300379  0.91664988  0.10833349  0.23239711  0.67742613
  0.66159408  0.72953811  0.55000021  2.37864661]

```

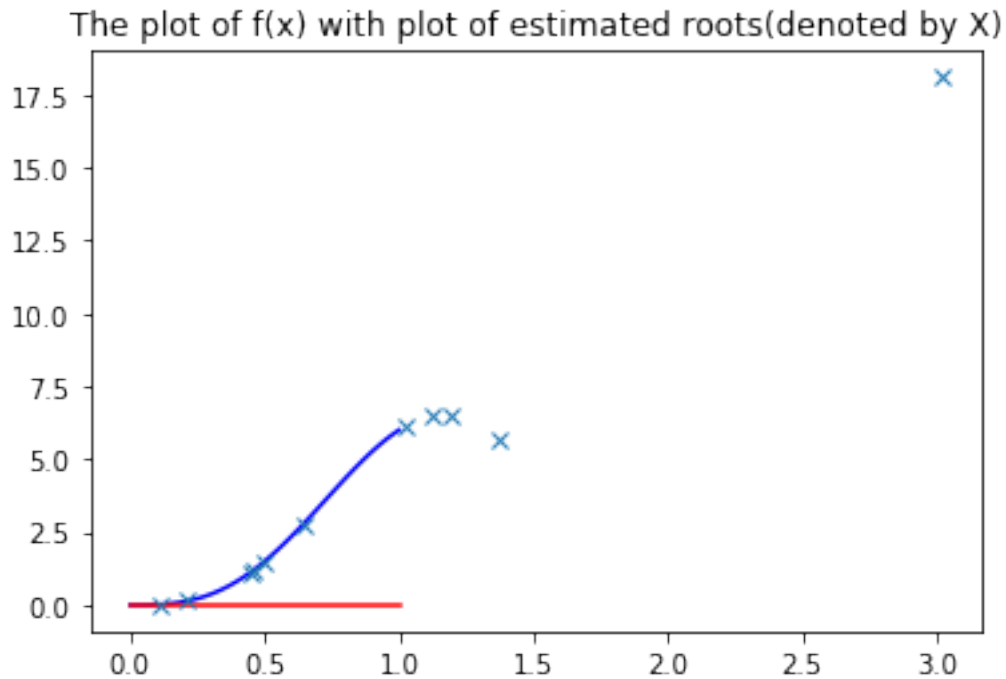
**We can observe that the error does not converge for this problem**

```

In [26]: plt.plot(x,f(x), 'b')
         plt.plot(x,0*x, 'r')

```

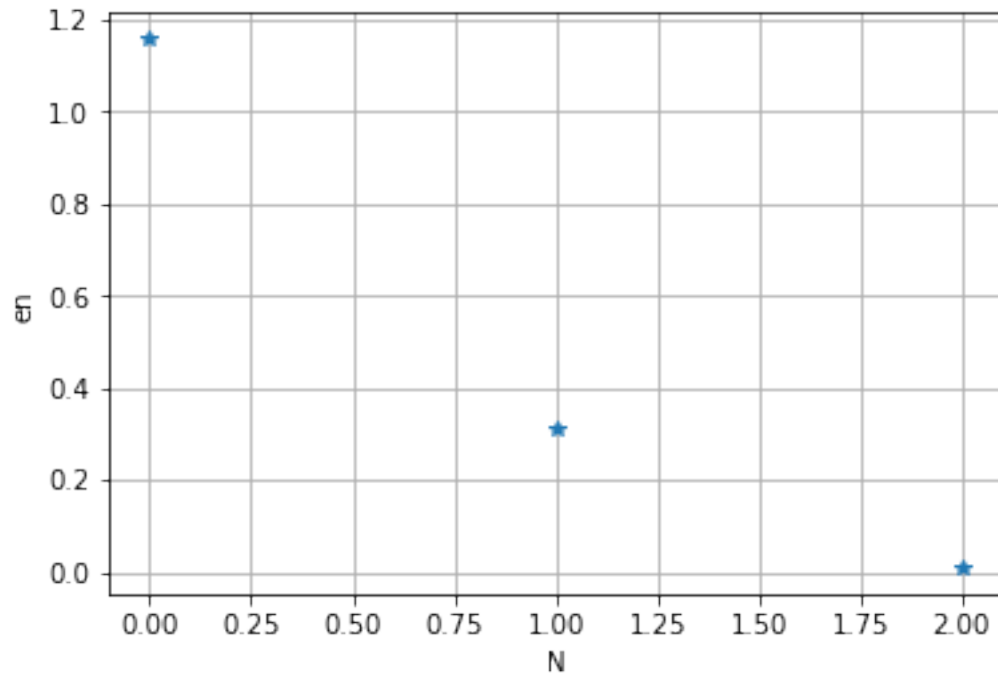
```
plt.plot(root,f(root),'x')
plt.title('The plot of f(x) with plot of estimated roots(denoted by X)')
plt.show()
```



### Problem 7:

**Given:** For  $f(x) = \sin(x)$  there is a root  $x \in [3,4]$  at  $x = \pi$ . We have to find the root using 03 iterations of newtons method with initial guess as  $p_0 = 4$

```
In [27]: x = np.linspace(3,4,101)
def f(x):
    return np.sin(x)
def df(x):
    return np.cos(x)
p0=4
root = g(p0,f,df,3)
print('the estimated roots are\n'+str(root))
```



the iterative error is

```
[ 1.15782128  0.30869422  0.00928055]
```

the estimated roots are

```
[ 4.          2.84217872  3.15087294  3.14159239]
```

```
In [28]: actual = np.zeros(len(root))
         actualp = np.zeros(len(root))
         er = np.zeros(len(root))
         erp = np.zeros(len(root))
         for i in range(0, len(root)-1):
             er[i] = np.abs(root[i+1] - root[i])
             actual[i] = np.abs(root[i] - np.pi)

         for i in range(0, len(root)-1):
             actualp[i] = actual[i+1]
             erp[i] = er[i+1]

         t = np.linspace(-5, 5, 101)
         plt.plot(t, 2*t, 'b') #for plotting y=2x
         plt.plot(t, t, 'r') #for plotting y=x
         plt.plot(np.log(actual), np.log(actualp), 'X')

         plt.xlabel('actual error for nth iteration')
         plt.ylabel('actual error for (n+1)th iteration ')
```

```

plt.title('log-log plot')
plt.grid(1)
plt.show()

print('log(actual)');print(np.log(actual))
print('log(actualp)');print(np.log(actualp))

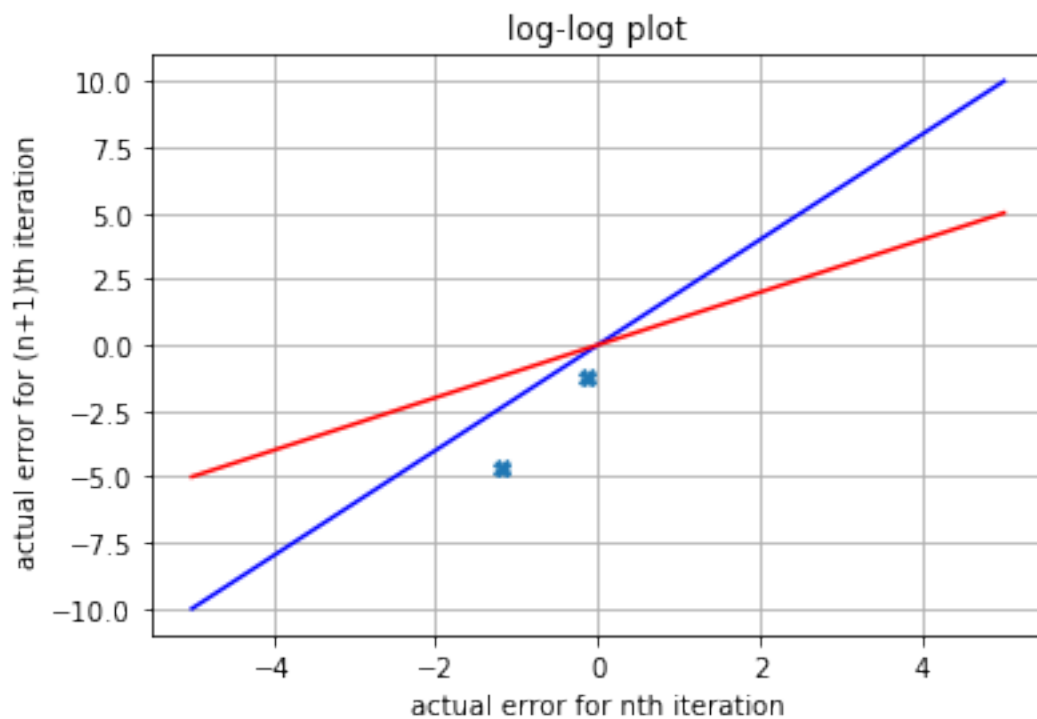
slope = (np.log(actualp[0])-np.log(actualp[1]))/(np.log(actual[0])-np.log(actual[1]))
print('\nApproximate slope(m) is '+str(slope))
print('actualp/(actual^m)');print(actualp/actual**slope)

```

```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:1
app.launch_new_instance()

```



```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:2

```

```

log(actual)
[-0.15267653 -1.20592826 -4.6798629          -inf]
log(actualp)
[-1.20592826 -4.6798629          -inf          -inf]

```

```

Approximate slope(m) is 3.298294733

```

```
actualp/(actual^m)
[ 0.49541669  0.49541669  0.          nan]
```

```
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:2
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:2
```

The apparent order of convergence of actual errors is the approximate slope **3.29**

```
In [29]: def ddf(x):
          return -np.sin(x)
          def dddf(x):
              return -np.cos(x)
          print('The last estimated root is '+str(root[-1])+
                ' and the corresponding value of f(x) is '+str(f(root[-1]))+'\n'+
                ' and df(x) is '+str(df(root[-1]))+'\n'+
                ' and ddf(x) is '+str(ddf(root[-1]))+'\n'+
                'and dddf(x) is '+str(dddf(root[-1]))'
```

```
The last estimated root is 3.14159238716 and the corresponding value of f(x) is 2.66426734575e-0
and df(x) is -1.0
and ddf(x) is -2.66426734575e-07
and dddf(x) is 1.0
```

As Calculated above  $f''(x) = 0$  therefore our convergence is higher than 02 and now  
 $|e_{n+1}| \approx \left| \frac{f'''(p)}{3f''(p)} \right| |e_n|^3$  where  $p$  is the approximate root.

### Problem 8:

a) The function is  $f(x) = x^4 - 18x^2 + 45 = 0$  has a root in the interval  $x \in [1, 2]$

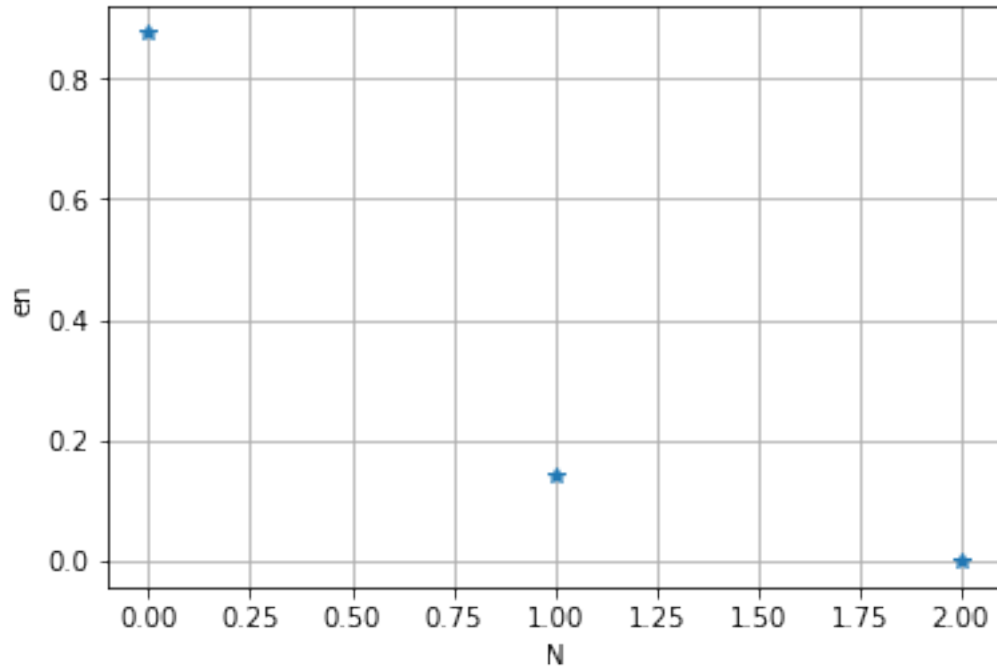
```
In [30]: a= 1; b=2;
          x = np.linspace(a,b,101)
          def f(x):
              return x**4-18*x**2+45
          def df(x):
              return 4*x**3-36*x
          print('f({})= '.format(a)+str(f(a))+
                ', f({})= '.format(b)+str(f(b))+
                ' and f({})*f({}) = '.format(a,b)+str(f(a)*f(b))+'\n')
          if f(a)*f(b)<0:
              print('Then there exists a root in the interval [ {}, {} ]'.format(a,b))
```

```
f(1)= 28, f(2)= -11 and f(1)*f(2) = -308
```

Then there exists a root in the interval  $[1, 2]$

Now, estimating root using newtons method for 3 iterations with  $p_0 = 1$

```
In [31]: p0=1;r=3**0.5
root = g(p0,f,df,3)
print('the estimated roots are\n'+str(root))
```



```
the iterative error is
[ 0.875      0.14396368  0.00101448]
the estimated roots are
[ 1.      1.875      1.73103632  1.73205081]
```

```
In [32]: actual = np.zeros(len(root))
actualp =np.zeros(len(root))
for i in range(0,len(root)-1):
    actual[i]=np.abs(root[i]-r)
for i in range(0,len(root)-1):
    actualp[i]=actual[i+1]

t=np.linspace(-5,5,101)
plt.plot(t,2*t,'b') #for plotting y=2x
plt.plot(t,t,'r')#for plotting y=x
plt.plot(np.log(actual),np.log(actualp),'X')
plt.xlabel('actual error for nth iteration')
plt.ylabel('actual error for (n+1)th iteration ')
```



```

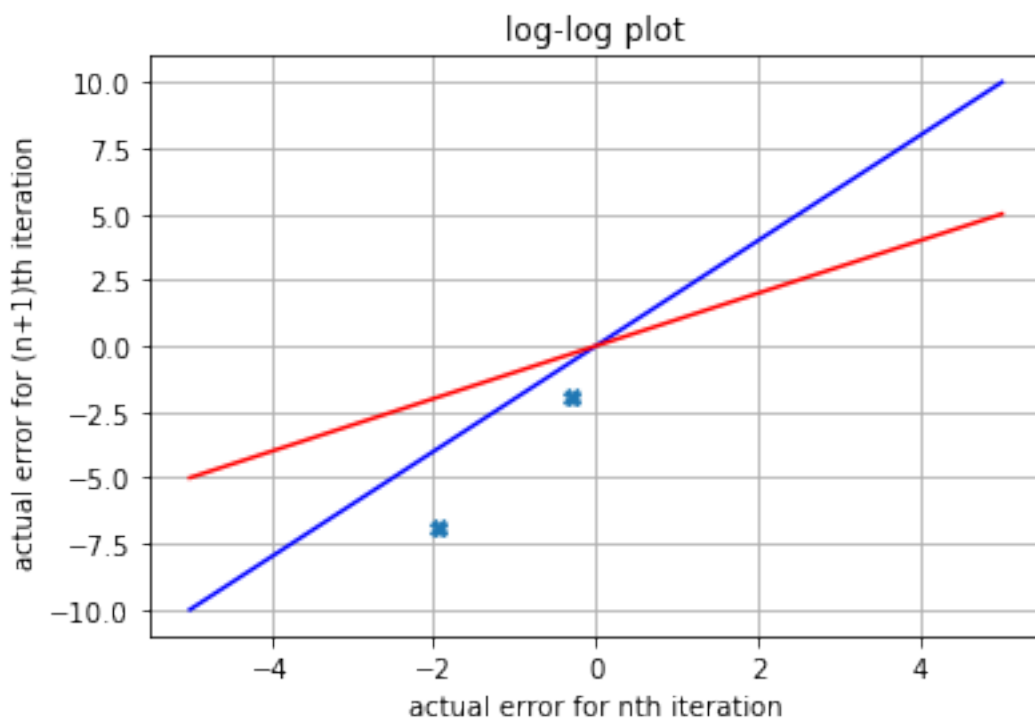
plt.title('log-log plot')
plt.grid(1)
plt.show()
print('log(actual)');print(np.log(actual))
print('log(actualp)');print(np.log(actualp))
slope = (np.log(actualp[0])-np.log(actualp[1]))/(np.log(actual[0])-np.log(actual[1]))
print('\nApproximate slope(m) is '+str(slope));print('\n')
print('actualp/(actual^m)');print(actualp/actual**slope);print('\n')
print('The apparent order of convergence is '+str(slope));print('\n')

```

```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:1
# This is added back by InteractiveShellApp.init_path()

```



```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:1

```

```

log(actual)
[-0.31190536 -1.94526601 -6.89337637      -inf]
log(actualp)
[-1.94526601 -6.89337637      -inf      -inf]

```

```

Approximate slope(m) is 3.02940465509

```

```
actualp/(actual^m)
[ 0.36774024  0.36774024  0.          nan]
```

The apparent order of convergence is 3.02940465509

```
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:1
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:2
```

```
In [33]: def ddf(x):
          return 12*x**2-36
          def dddf(x):
              return 24*x
          print('The last estimated root is '+str(root[-1])+
                ' and the corresponding value of f(x) is '+str(f(root[-1]))+'\n'+
                ' and df(x) is '+str(df(root[-1]))+' and ddf(x) is '+str(ddf(root[-1]))+'\n'+
                ' and dddf(x) is '+str(dddf(root[-1])))
```

The last estimated root is 1.73205080792 and the corresponding value of f(x) is -1.44640353028e-08  
and df(x) is -41.5692193817 and ddf(x) is 1.44640281974e-08  
and dddf(x) is 41.56921939

As Calculated above  $f''(x) = 0$  therefore our convergence is higher than 02 and now  
 $|e_{n+1}| \approx \left| \frac{f'''(p)}{3f''(p)} \right| |e_n|^3$  where  $p$  is the approximated root  
 b) The function is  $f(x) = x^4 - 18x^2 + 45 = 0$  has a root in the interval  $x \in [3, 4]$

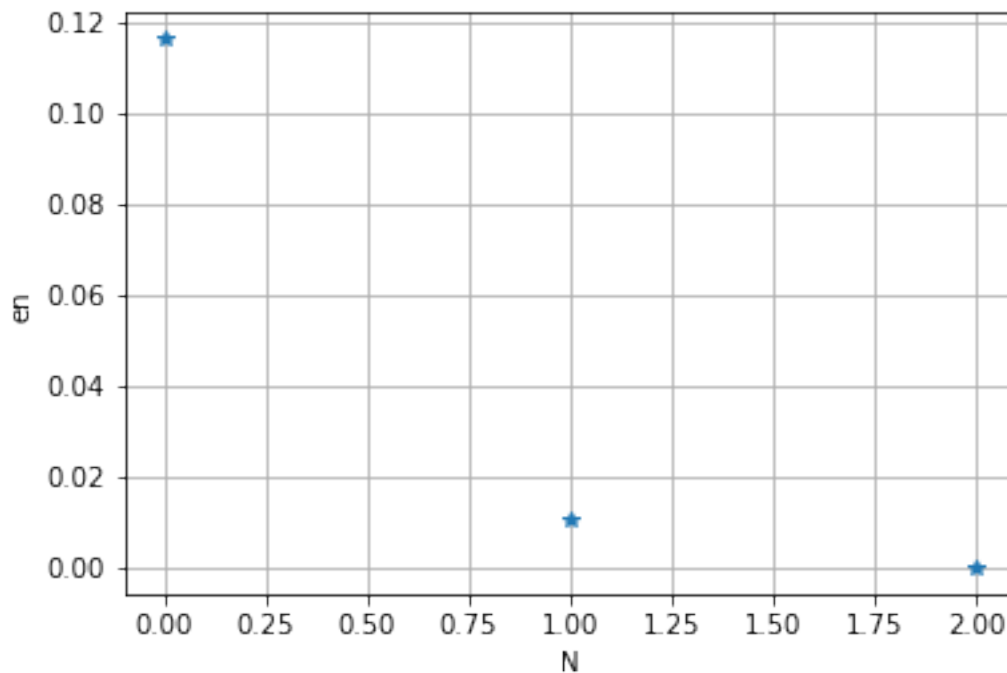
```
In [34]: a= 3; b=4;
          x = np.linspace(a,b,101)
          def f(x):
              return x**4-18*x**2+45
          def df(x):
              return 4*x**3-36*x
          print('f({})= '.format(a)+str(f(a))+', f({})= '.format(b)+str(f(b))+
                ' and f({})*f({}) = '.format(a,b)+str(f(a)*f(b))+'\n')
          if f(a)*f(b)<0:
              print('Then there exists a root in the interval [ {}, {} ]'.format(a,b))
```

f(3)= -36, f(4)= 13 and f(3)\*f(4) = -468

Then there exists a root in the interval [3,4]

Now, estimating root using newtons method for 5 iterations with  $p_0 = 4$

```
In [35]: p0=4;r=15**0.5
root = g(p0,f,df,3)
print('the estimated roots are\n'+str(root))
```



```
the iterative error is
[ 1.16071429e-01  1.08535525e-02  9.16661997e-05]
the estimated roots are
[ 4.          3.88392857  3.87307502  3.87298335]
```

```
In [36]: actual = np.zeros(len(root))
actualp = np.zeros(len(root))
for i in range(0,len(root)-1):
    #er[i]=np.abs(root[i+1]-root[i])
    actual[i]=np.abs(root[i]-r)
for i in range(0,len(root)-1):
    actualp[i]=actual[i+1]
    #erp[i]=er[i+1]
t=np.linspace(-5,5,101)
plt.plot(t,2*t,'b') #for plotting y=2x
plt.plot(t,t,'r') #for plotting y=x
plt.plot(np.log(actual),np.log(actualp),'X')
plt.xlabel('actual error for nth iteration')
plt.ylabel('actual error for (n+1)th iteration ')
plt.title('log-log plot')
```

```

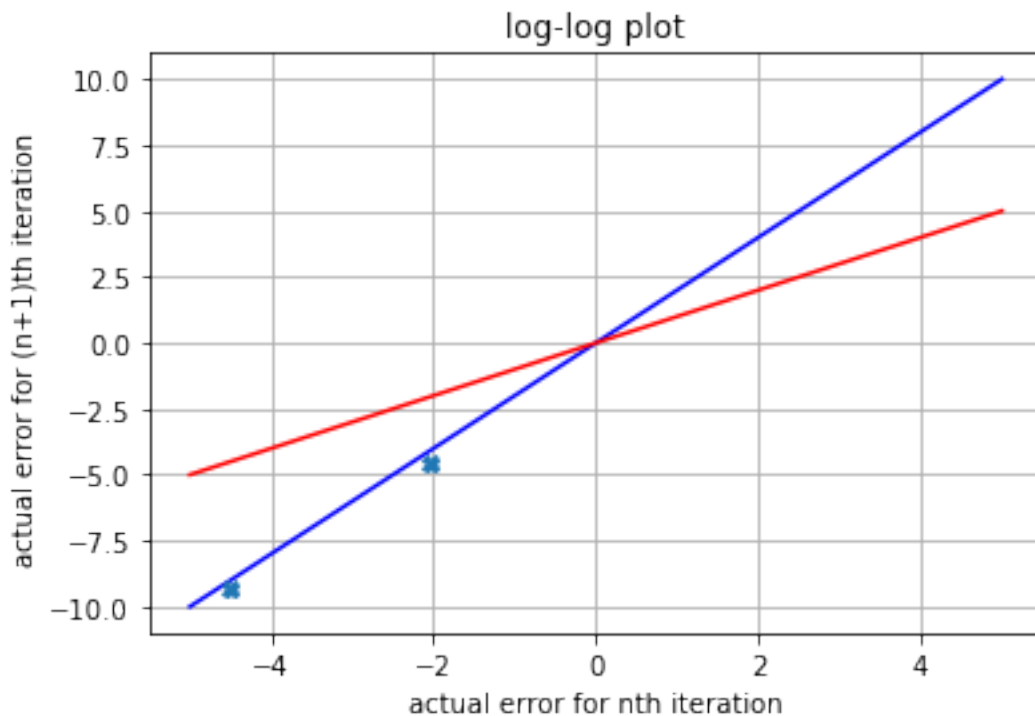
plt.grid(1)
plt.show()
print('log(actual)');print(np.log(actual))
print('log(actualp)');print(np.log(actualp))
slope = (np.log(actualp[0])-np.log(actualp[1]))/(np.log(actual[0])-np.log(actual[1]))
print('\nApproximate slope(m) is '+str(slope));print('\n')
print('actualp/(actual^m)');print(actualp/actual**slope);print('\n')
print('The apparent order of convergence is '+str(slope));print('\n')

```

```

/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:1
if sys.path[0] == '':

```



```

log(actual)
[-2.06343707 -4.51485197 -9.29728584      -inf]
log(actualp)
[-4.51485197 -9.29728584      -inf      -inf]

```

Approximate slope(m) is 1.9508871651

```

actualp/(actual^m)
[ 0.61304369  0.61304369  0.          nan]

```

The apparent order of convergence is 1.9508871651

```
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:1
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:1
/apps/share64/debian7/anaconda/anaconda3-4.4/lib/python3.6/site-packages/ipykernel_launcher.py:2
```

As the log-log plot of errors is along the  $y=2x$  line therefore the order of convergence is 2

```
In [37]: def ddf(x):
          return 12*x**2-36
          print('The last estimated root is '+str(root[-1])+
                ' and the corresponding value of f(x) is '+str(f(root[-1]))+'\n'+
                ' and df(x) is '+str(df(root[-1]))+'\n'+ ' and ddf(x) is '+str(ddf(root[-1])))
```

```
The last estimated root is 3.87298335272 and the corresponding value of f(x) is 6.05017703492e-0
and df(x) is 92.9516012463
and ddf(x) is 144.000000605
```

c) From the above calculations, we can conclude that the apparent order of convergence for the newtons method depends on the value of the  $f''(x), f'''(x)$ .....

---

### Problem 9:

**Given:** For  $f(x) = \sin(x)$  there is a root  $x \in [3, 4]$  at  $x = \pi$ . We have to find the root using 05 iterations of secants method with initial guess as  $p_0=3$  and  $p_1=4$

```
In [38]: N=5
          p = np.zeros(2+N)
          p[0]=3
          p[1]=4
          def f(x):
              return np.sin(x)
          for i in range(0,N):
              p[i+2]=p[i+1]-(f(p[i+1]))/((f(p[i+1]))-f(p[i]))/(p[i+1]-p[i]))
          print(p)
          r= np.pi
          root = p

[ 3.          4.          3.15716279  3.1394591   3.14159273  3.14159265
 3.14159265]
```

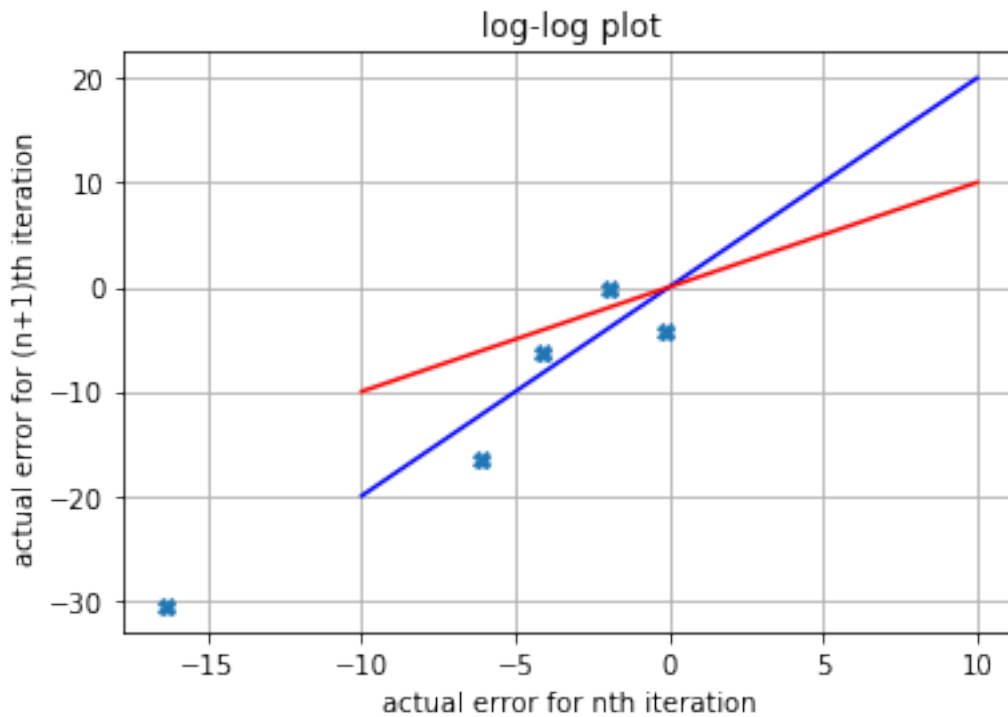
```

In [39]: actual = np.zeros(len(root))
        actualp = np.zeros(len(root))

        for i in range(0, len(root)-1):
            actual[i] = np.abs(root[i] - r)
        for i in range(0, len(root)-1):
            actualp[i] = actual[i+1]

        t = np.linspace(-10, 10, 101)
        plt.plot(t, 2*t, 'b') #for plotting y=2x
        plt.plot(t, t, 'r') #for plotting y=x
        plt.plot(np.log(actual[:N]), np.log(actualp[:N]), 'X')
        plt.xlabel('actual error for nth iteration')
        plt.ylabel('actual error for (n+1)th iteration ')
        plt.title('log-log plot')
        plt.grid(1)
        plt.show()
        print('log(actual)'); print(np.log(actual[:N]))
        print('log(actualp)'); print(np.log(actualp[:N]))

```



```

log(actual)
[ -1.95480098  -0.15267653  -4.16240037  -6.1499655  -16.41387624]
log(actualp)

```

```
[ -0.15267653  -4.16240037  -6.1499655   -16.41387624 -30.50631912]
```

```
In [40]: x_av= sum(np.log(actual[:N]))/N;
          y_av= sum(np.log(actualp[:N]))/N;
          A = 0;B=0;
          for i in range(0,N):
              A = A+((actual[i]-x_av)*(actualp[i]-y_av))
              B = B+(actual[i]-x_av)**2
          m = A/B;
          print('We can observe that the log-log plot of the errors do not follow'+'\n'+
                ' the line y=x or y=2x but rather will be a line with slope {}'.format(m))
```

We can observe that the log-log plot of the errors do not follow  
the line  $y=x$  or  $y=2x$  but rather will be a line with slope 1.945463552046095

Therefore, convergence of Secant method  $\rightarrow$  Newtons Method

As the Secant Method uses *finite derivative* to **approximate** the value of the *exact derivative* hence  
it's convergence order also approximates to the order of Newtons method. i.e. *convergence of  
secant method*  $\rightarrow 2$