ΠΑΝΕΠΙΣΤΗΜΙΟ ΚΥΠΡΟΥ ΣΧΟΛΗ ΘΕΤΙΚΩΝ ΚΑΙ ΕΦΑΡΜΟΣΜΕΝΩΝ ΕΠΙΣΤΗΜΩΝ ΤΜΗΜΑ ΦΥΣΙΚΗΣ

ΦΥΣ 140 Εισαγωγή στην Επιστημονική Χρήση Υπολογιστών Χειμερινό Εξάμηνο 2023

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Φροντιστήριο 9

Παράδειγμα 1 Εύρεση λύσης της μη γραμμικής εξίσωσης $f(x)=x^3-2x^2+2$ με τη μέθοδο Newton-Raphson, βήμα προς βήμα με γραφικές παραστάσεις:

tutorial9/ex1.py

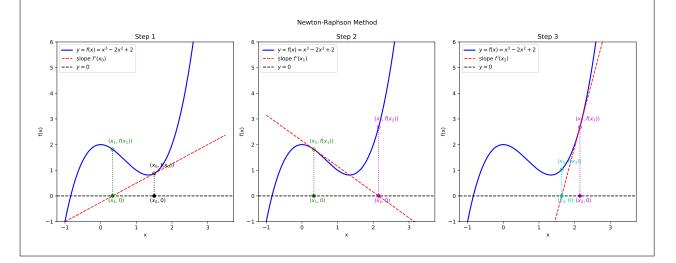
```
#!/usr/bin/python3
2 111
  USAGE:
     chmod +x ex3.py
     python3 ex3.py
     script -q ex3.log python3 -i ex3.py
  import sympy as s
  import numpy as np
  import matplotlib.pyplot as plt
11
   def getNewtonRaphsonRoot(f, dfdx, x, epsilon, nStepsMax=100, debug=True):
13
       x_{n+1} = x_{n} - [f(x_{n}) / f'(x_{n})]
15
       if debug:
           print("=== ex1.py: getNewotonRaphsonRoot()")
17
       nSteps = 0
       roots = [x]
19
       fVal = f(x)
2.1
       while abs(f(x)) > epsilon and nSteps < nStepsMax:
           try:
23
               x = x - f(x) / dfdx(x)
           except:
               print("\tError! - derivative zero for x = ", x)
26
               exit(1)
           roots.append(x)
28
           fVal = f(x)
           nSteps+=1
30
           if debug:
31
               print("\tStep %d, x=%.6f, epsilon=%e" % (nSteps, roots[-1], fVal) )
32
       # Either a solution is found, or too many iterations
34
       if abs(fVal) > epsilon:
           nSteps = -1
36
       return roots, nSteps
   def plotRoot(x, y, c="k", index=0):
40
       plt.plot([x], [0], c+"o")
41
       plt.plot([x, x], [0, y], c+':')
42
       plt.text(x-0.12, -0.25, r"\frac{d}{d}, \frac{d}{d}, \frac{d}{d}, \frac{d}{d}, \frac{d}{d}
43
       plt.plot([x], [y], c+"o", fillstyle='none')
45
       plt.text(x-0.12, y+0.25, r"$\left(x_{8d}), f(x_{8d})\right)$" % (index,
      index), color=c)
```

```
return
47
48
49
50 # Define symbolic variable and expression
x = s.Symbol("x")
F = x**3 - 2*x**2 + 2
DF = s.diff(F, x)
  # Create Python function f and df from SymPy expressions F and DF (evaluated
     numerically)
56 f
     = s.lambdify(x, F, 'numpy')
of = s.lambdify(x, DF, 'numpy')
see eq = s.Eq(F, 0)
59 exactRoots = s.solve(eq, x)
realRoots = [root.evalf() for root in exactRoots if root.is_real]
print ("=== Function and derivative: \n \t (x) = ", F)
  print("\tdf(x) = ", DF)
# Define various variables
xSeed = 1.5
epsilon = 1e-06
                   # number of iterations
nSteps = 3
rootList = [xSeed] # first root is the seed
_{70} xList = np.arange(-1.0, 3.5, 0.0001) # np.linspace(-0.5, 2.3, 400)
71 fxList
           = f(xList)
72 cList = ["k", "g", "m", "c", "y"]
saveName = "ex1_x0%s" % (str(xSeed).replace(".", "p"))
74 np_Roots, np_Steps = getNewtonRaphsonRoot(f, df, xSeed, epsilon)
         = np_Roots[-1]
75 np_X
76 if np_Steps > 0:
      print( "=== ex1.py\n\tFound root to be '%.3f' after %d iterations!" % (np_X
     , np_Steps) )
  else:
      print("=== ex1.py\n\tSolution not found!")
79
80
81
82 print("=== ex1.py: Plot")
# Create a figure with subplots
84 plt.figure(figsize=(16, 6)).suptitle("Newton-Raphson Method")
  *plt.figure(figsize=(16, 6)).suptitle(r"$f(x) = %s$ , $f\,'(x) = %s$" % (s.
      latex(F), s.latex(DF)) )
  # Perform Newton-Raphson iterations
  for i in range(nSteps):
      # Coordinates of the root
90
      x0 = rootList[-1]
      # Construct the tangent equation y_{tan} = f(x0) + f'(x0) * (x-x0)
      tList = [f(x0) + df(x0) * (x - x0)  for x  in xList]
95
     # Find the next root using Newton-Raphson
```

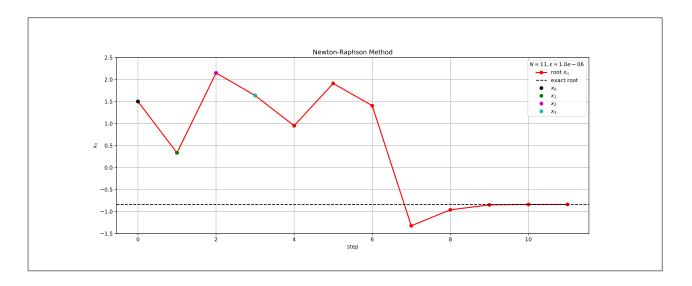
```
xi = x0 - f(x0) / df(x0)
97
       rootList.append(xi)
98
       print("\tStep %d, x_{\%d}=\%.3f, x_{\%d}=\%.3f - f(\%.3f) / df(\%.3f) = %.3f" %
99
       (i+1, i, x0, i+1, x0, x0, x0, xi)
100
       # Create each plot on a separate pad
       plt.subplot(1, nSteps, i+1)
       # Plot the function we are trying to find the root of
104
       plt.plot(xList, fxList, "b-", lw=2, label=r'y=f(x)=%s' % s.latex(F))
106
       # Plot the current root
       plotRoot(x0, f(x0), cList[i], i)
       # Plot the tangent point/line
111
       plt.plot(xList, tList, "r--", label=r"slope f', (x_{$d})$" % (i) )
       # Add v=0
113
       plt.axhline(0, color="k", linestyle="--", label=r"$y=0$")
114
115
       # Plot the next root estimate
117
       plotRoot(xi, f(xi), cList[i+1], i+1)
       # Customise axes
119
       plt.title(f'Step {i+1}')
       plt.xlabel('x')
121
       plt.ylabel('f(x)')
       plt.ylim(-1, 6)
       plt.legend(loc='upper left')
       plt.grid(False)
plt.tight_layout()
   for ext in [".png", ".pdf"]:
127
128
       plt.savefig(saveName + ext)
129
# Create a figure with the roots
plt.figure(figsize=(16, 6))
plt.plot(np_Roots, "ro-", lw=2, label=r'root $x_{n}$')
plt.axhline(realRoots[0], color="k", linestyle="--", label="exact root")
for i in range (nSteps+1):
       plt.plot([i], np_Roots[i], cList[i]+"o", label=r'$x_{%d}$' % (i))
135
plt.xlabel('step')
plt.ylabel(r'$x_{n}$')
138 plt.ylim(-1.5, +2.5)
plt.title('Newton-Raphson Method')
140 plt.grid(True)
plt.legend(loc='upper right', title=r'$N=%d, \epsilon=%.1e$' % (np_Steps,
       epsilon) )
   for ext in [".png", ".pdf"]:
       plt.savefig(saveName + "-roots" + ext)
plt.show()
```

Αποτέλεσμα:

```
=== Function and derivative:
 f(x) = x * * 3 - 2 * x * * 2 + 2
 df(x) = 3*x**2 - 4*x
=== ex1.py: getNewotonRaphsonRoot()
 Step 1, x=0.333333, epsilon=1.814815e+00
 Step 2, x=2.148148, epsilon=2.683636e+00
  Step 3, x=1.637080, epsilon=1.027363e+00
  Step 4, x=0.948393, epsilon=1.054133e+00
  Step 5, x=1.910874, epsilon=1.674562e+00
  Step 6, x=1.405090, epsilon=8.254823e-01
  Step 7, x=-1.324018, epsilon=-3.827083e+00
  Step 8, x=-0.961438, epsilon=-7.374450e-01
  Step 9, x=-0.850022, epsilon=-5.924849e-02
  Step 10, x=-0.839381, epsilon=-5.140478e-04
 Step 11, x=-0.839287, epsilon=-3.988341e-08
=== ex1.py
 Found root to be '-0.839' after 11 iterations!
=== ex1.py: Plot
 Step 1, x_{0}=1.500, x_{1}=1.500 - f(1.500) / df(1.500) = 0.333
 Step 2, x_{1}=0.333, x_{2}=0.333 - f(0.333) / df(0.333) = 2.148
 Step 3, x_{2}=2.148, x_{3}=2.148-f(2.148)/df(2.148)=1.637
```



Παράδειγμα 1 συνεχίζεται...



Παράδειγμα 2 Εύρεση λύσης της μη γραμμικής εξίσωσης $f(x) = x^3 - 2x^2 + 2$ με τη μέθοδο Secant, βήμα προς βήμα με γραφικές παραστάσεις:

tutorial9/ex2.py

```
#!/usr/bin/python3
2 111
  USAGE:
     chmod + x ex3.py
     python3 ex3.py
     script -q ex3.log python3 -i ex3.py
6
  import sympy as s
   import numpy as np
   import matplotlib.pyplot as plt
11
   def secant(f, x0, x1):
12
       x = None
13
14
       try:
           num = f(x1) * (x1 - x0)
15
           den = f(x1) - f(x0)
           x = x1 - num/den
17
       except:
           print("\tError! Denominator is zero for x0 = %s, x1 = %s" % (x0, x1))
19
           exit(1)
       return x
21
22
   def getSecantRoot(f, x0, x1, epsilon, nStepsMax=100, debug=True):
2.3
       x_{n+1} = x_{n} - f(x_{n}) [ (x_{n} - x_{n-1}) / (f(x_{n}) - f(x_{n-1})) )
25
      ]
       ,,,
26
27
       if debug:
           print("=== ex2.py: getNewotonRaphsonRoot()")
28
       nSteps = 0
29
       roots = [x0, x1]
30
       fVal0 = f(x0)
31
       fVal1 = f(x1)
32
33
       while abs(fVal1) > epsilon and nSteps < nStepsMax:</pre>
           try:
35
               num = fVal1 * (x1 - x0)
                den = fVal1 - fVal0
37
                x = x1 - num/den
           except:
39
                print("\tError! Denominator is zero for x0 = %s, x1 = %s" % (x0, x1
40
      ) )
                exit(1)
41
           roots.append(x)
42
43
           if debug:
44
                print("\tStep %d, x0=%.6f, x1=%.6f, x2=%.6f, epsilon=%e" % (nSteps,
45
       x0, x1, x, fVal1)
           # Re-set values
46
```

```
x0 = x1
47
          x1 = x
          fVal0 = fVal1
49
          fVal1 = f(x1)
          nSteps+=1
51
      # Either a solution is found, or too many iterations
53
      if abs(fVal1) > epsilon:
          nSteps = -1
55
      return roots, nSteps
57
  def plotRoot(x, y, c="k", index=0):
59
      plt.plot([x], [0], c+"o")
60
      plt.plot([x, x], [0, y], c+':')
61
      plt.text(x-0.12, -0.25, r"\theta\left(x_{\theta}, \theta), \theta' \theta (index), color=c)
62
63
     plt.plot([x], [y], c+"o", fillstyle='none')
      plt.text(x-0.12, y+0.25, r"\{\d, f(x_{d})\right)$" % (index,
     index), color=c)
      return
67
# Define symbolic variable and expression
x = s.Symbol("x")
F = x**3 - 2*x**2 + 2
# Create Python function f and df from SymPy expression F
f = s.lambdify(x, F, 'numpy')
eq = s.Eq(F, 0)
exactRoots = s.solve(eq, x)
realRoots = [root.evalf() for root in exactRoots if root.is_real]
# Define various variables
       = 2.0 # 2.2 # 2.7 #2.0
          = 1.3 # 1.8 # x0-1.0 #x0-0.8
81 x1
epsilon = 1e-06
nSteps = 3
rootList = [x0, x1] # new two seeds
xList = np.arange(-1.0, 3.5, 0.0001)
86 fxList
           = f(xList)
so clist = ["k", "g", "m", "c", "y"]
saveName = "ex2_x0%s_x1%s" % (str(x0).replace(".", "p"), str(x1).replace(".",
      "p") )
sec_Roots, sec_Steps = getSecantRoot(f, x0, x1, epsilon)
90 sec X
         = sec_Roots[-1]
91 if sec_Steps > 0:
      print( "=== ex2.py\n\tFound root to be '%.3f' after %d iterations!" % (
      sec_X, sec_Steps) )
      print("=== ex2.py\n\tSolution not found!")
94
95
96
```

```
97 print("=== ex2.py: Plot")
   # Create a figure with subplots
   plt.figure(figsize=(16, 6)).suptitle("Secant Method")
    # Perform iterations
101
   for i in range(0, nSteps, 1):
103
        # Coordinates of the root
        x0 = rootList[i]
105
        x1 = rootList[i+1]
        x2 = secant(f, x0, x1) # find the next root using Secant method
107
        rootList.append(x2)
        # Construct the tangent equation y_{tan} = f(x0) + f'(x0) * (x-x0)
        tList = [f(x0) + (f(x1) - f(x0)) * (x - x0) / (x1 - x0)  for x in xList]
111
        print("\tStep %d, x_{\text{d}}=%.2f, x_{\text{d}}=%.2f, x_{\text{d}}=%.2f, x_{\text{d}}=%.2f" % (i+1, i, x_{\text{d}}0, x_{\text{d}}=%.2f" % (i+1, i, x_{\text{d}}0, x_{\text{d}}=%.2f" % (i+1, i, x_{\text{d}}0, x_{\text{d}}=%.2f" % (i+1, i, x_{\text{d}}=%.2f" % (i+1, i)
        i+1, x1, i+2, x2)
        # Create each plot on a separate pad
114
        plt.subplot(1, nSteps, i+1)
        # Plot the function we are trying to find the root of
        plt.plot(xList, fxList, "b-", lw=2, label=r'$y=f(x)=%s$' % (s.latex(F)))
119
        # Plot the current root
        plotRoot(x0, f(x0), cList[i], i)
121
        plotRoot(x1, f(x1), cList[i], i+1)
        # Plot the tangent point/line
        plt.plot(xList, tList, "r--", label=r"chord x_{%d}\ and x_{%d}\ % (i, i
        +1) )
126
        \# Add y=0
128
        plt.axhline(0, color="k", linestyle="--", label=r"$y=0$")
129
        # Plot the next root estimate
        plotRoot(x2, f(x2), cList[i+1], i+2)
        # Customise axes
        plt.title(f'Step {i+1}')
        plt.xlabel('x')
135
        plt.ylabel('f(x)')
        plt.ylim(-1, 4)
137
        plt.legend(loc='upper left')
        plt.grid(False)
plt.tight_layout()
   for ext in [".png", ".pdf"]:
        plt.savefig(saveName + ext)
143
# Create a figure with the roots
plt.figure(figsize=(16, 6))
plt.plot(sec_Roots, "ro-", lw=2, label=r'root $x_{n}$')
147 plt.axhline(realRoots[0], color="k", linestyle="--", label="exact root")
```

```
for i in range(nSteps+1):
    plt.plot([i], sec_Roots[i], cList[i]+"o", label=r'$x_{%d}$' % (i))

plt.xlabel('step')

plt.ylabel(r'$x_{n}$')

plt.title('Secant Method')

plt.grid(True)

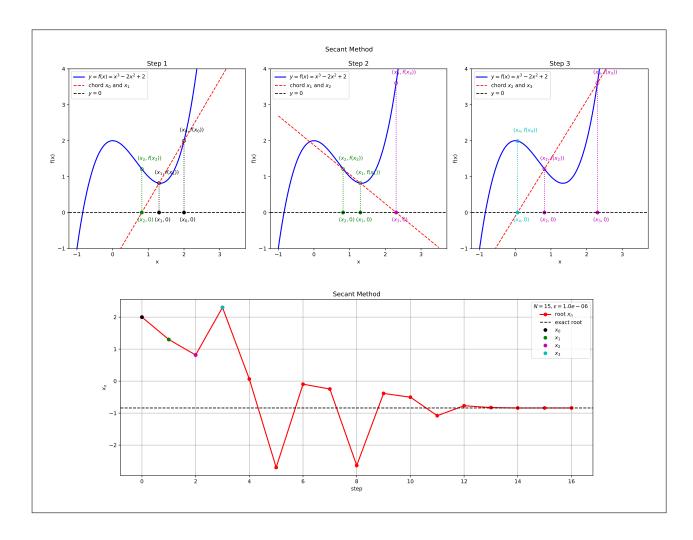
plt.legend(loc='upper right', title=r'$N=%d, \epsilon=%.1e$' % (sec_Steps, epsilon))

for ext in [".png", ".pdf"]:
    plt.savefig(saveName + "-roots" + ext)

plt.show()
```

Αποτέλεσμα:

```
=== ex2.py: getNewotonRaphsonRoot()
 Step 0, x0=2.000000, x1=1.300000, x2=0.816568, epsilon=8.170000e-01
  Step 1, x0=1.300000, x1=0.816568, x2=2.302683, epsilon=1.210907e+00
  Step 2, x0=0.816568, x1=2.302683, x2=0.064884, epsilon=3.604928e+00
  Step 3, x0=2.302683, x1=0.064884, x2=-2.698390, epsilon=1.991853e+00
  Step 4, x0=0.064884, x1=-2.698390, x2=-0.096042, epsilon=-3.221042e+01
  Step 5, x0=-2.698390, x1=-0.096042, x2=-0.246794, epsilon=1.980666e+00
  Step 6, x0=-0.096042, x1=-0.246794, x2=-2.636966, epsilon=1.863154e+00
  Step 7, x0=-0.246794, x1=-2.636966, x2=-0.385496, epsilon=-3.024355e+01
  Step 8, x0=-2.636966, x1=-0.385496, x2=-0.501673, epsilon=1.645498e+00
 Step 9, x0=-0.385496, x1=-0.501673, x2=-1.080381, epsilon=1.370388e+00
  Step 10, x0=-0.501673, x1=-1.080381, x2=-0.769066, epsilon=-1.595492e+00
  Step 11, x0=-1.080381, x1=-0.769066, x2=-0.826664, epsilon=3.622016e-01
  Step 12, x0=-0.769066, x1=-0.826664, x2=-0.840057, epsilon=6.833459e-02
 Step 13, x0=-0.826664, x1=-0.840057, x2=-0.839279, epsilon=-4.217661e-03
 Step 14, x0=-0.840057, x1=-0.839279, x2=-0.839287, epsilon=4.425810e-05
=== ex2.py
 Found root to be '-0.839' after 15 iterations!
=== ex2.py: Plot
 Step 1, x_{0}=2.00, x_{1}=1.30, x_{2}=0.82
  Step 2, x_{1}=1.30, x_{2}=0.82, x_{3}=2.30
 Step 3, x_{2}=0.82, x_{3}=2.30, x_{4}=0.06
```



Παράδειγμα 3 Απλά παραδείγματα για βασικές πράξεις μεταξύ συμβόλων με τη βοήθεια της SymPy:

tutorial9/ex3.py

```
#!/usr/bin/python3
  , , ,
3 USAGE:
    chmod +x ex3.py
    python3 ex3.py
    script -q ex3.log python3 -i ex3.py
  import sympy as s
# Define symbolic variables
x, y = s.symbols('x y')
12
13
# Function definitions
f = s.sin(x)/x
  print ("Function f(x): \n t", f)
17
# Differentiation / Integration wrt x
df_dx = s.diff(f, x)
intx f = s.integrate(df dx, x)
print("Differentiation df(x)/dx:\n\t", df_dx)
print("Integral of df_dx:\n\t", intx_f)
# Limit evaluation (in SymPy the symbol s.oo represent positive infinity)
\lim_{x \to 0} x_0 = s.limit(f, x, 0) # Limit of f as x approaches 2
28 lim_x_inf = s.limit(f, x, s.oo) # Limit of 1/f as x approaches infinity
29 print("Limit as x -> 0:\n\t"
                               , lim_x_0)
print("Limit as x -> infty:\n\t", lim_x_inf)
  # L'Hopital rule: \lim_{x\to c} f(x) / g(x) == \lim_{x\to c} f'(x) / g'(x)
# Equation solving
eq = s.Eq(f, 0) # Define the equation f = 0
solutions = s.solve(eq, x) # Solve for x in the equation
  print("Solutions of f(x) = 0: \n t", solutions)
38
^{40} # Taylor expansion around x=0, up to 5 terms
taylor_expansion_f = s.series(f, x, 0, 5)
print("Taylor expansion of f(x):\n\t", taylor_expansion_f)
```

Αποτέλεσμα:			

Παράδειγμα 3 συνεχίζεται...

```
Function f(x):
    sin(x)/x
Differentiation df(x)/dx:
    cos(x)/x - sin(x)/x**2
Integral of df_dx:
    sin(x)/x
Limit as x -> 0:
    1
Limit as x -> infty:
    0
Solutions of f(x) = 0:
    [pi]
Taylor expansion of f(x):
    1 - x**2/6 + x**4/120 + O(x**5)
```

Παράδειγμα 4 Παράδειγμα εύρεσης ριζών με τη μέθοδο διχοτόμησης Bisection method:

tutorial9/ex4.py

```
#!/usr/bin/python3
2 , , ,
3 USAGE:
     chmod +x ex3.py
     python3 ex3.py
     script -q ex3.log python3 -i ex3.py
7
8 import sympy as s
9 import numpy as np
  import matplotlib.pyplot as plt
10
11
   def bisection(f, xL, xR):
12
       fxL = f(xL)
13
14
      fxR = f(xR)
       x = (xL + xR) / 2
       fx = f(x)
16
17
       if (fx * fxL > 0):
18
           xL = x
           fxL = f(xL)
2.0
       else:
21
           xR = x
22
       # Find the new midpoint
       x = (xL + xR) / 2
25
       fx = f(x)
26
       return x, xL, xR
27
28
29
   def getBisectionRoots(f, xL, xR, epsilon, nStepsMax=100, debug=True):
31
      Finds the root of the function f within the interval [xL, xR] using the
32
      Bisection method.
       ,,,,
       if debug:
34
           print("=== ex4.py")
36
       fxL = f(xL)
       fxR = f(xR)
38
       if fxL * fxR > 0:
40
           print ("Error! Function does not have opposite signs at interval
41
      endpoints [!")
           exit(1)
42
       nSteps = 1
44
       roots = []
45
       x = (xL + xR) / 2
46
       fx
            = f(x)
47
48
```

```
while abs(fx) > epsilon and nSteps < nStepsMax:</pre>
49
50
           if (fx * fxL > 0):
51
               # same sign
               xL = x
53
               fxL = f(xL)
           else:
55
               # opposite sign
               xR = x
57
           # Find the new midpoint
59
           x = (xL + xR) / 2
           fx = f(x)
           roots.append(x)
62
           if debug:
63
               print("\tStep %d, xL=%.6f, xR=%.6f, epsilon=%e" % (nSteps, xL, xR,
64
      (xR - xL) / 2))
           nSteps += 1
65
66
       return roots, nSteps
67
   def plotRoot(x, y, c, subscript):
69
       plt.plot([x], [0], c+"o")
71
       plt.plot([x, x], [0, y], c+':')
       plt.text(x-0.12, +0.25, r"\frac{(x_{\$})}{(x_{\$})}, 0\right)$" % (subscript), color=c)
73
       plt.plot([x], [y], c+"o", fillstyle='none')
75
       plt.text(x-0.12, y+0.25, r"$\left(x_{%s}, f(x_{%s})\right)$" % (subscript,
76
      subscript), color=c)
       return
77
78
# Define symbolic variable and expression
x = s.Symbol("x")
F = x * * 3 - 2 * x * * 2 + 2
f = s.lambdify(x, F, 'numpy')
eq = s.Eq(F, 0)
exactRoots = s.solve(eq, x)
  realRoots = [root.evalf() for root in exactRoots if root.is_real]
87
# Define various variables
           = -1.3
90 xL
91 xR
           = +1.3
92 X
           = (xL + xR) / 2
epsilon = 1e-06
          = 3
94 nSteps
95 rootList = []
_{96} xList = np.arange(xL, xR, 0.0001)
fxList = f(xList)
           = ["k", "g", "m", "c", "y"]
98 cList
99 bi_Roots, bi_Steps = getBisectionRoots(f, xL, xR, epsilon)
```

```
\# x, xL, xR = bisection(f, xL, xR)
   if nSteps > 0:
       print( "=== ex4.py\n\tFound root to be '%.3f' after %d iterations!" % (
      bi_Roots[-1], bi_Steps) )
   else:
       print("=== ex4.py\n\tSolution not found!")
104
105
   print("=== ex4.py: Plot")
   # Create a figure with subplots
   plt.figure(figsize=(16, 6)).suptitle("Bisection Method")
   # Perform Newton-Raphson iterations
   for i in range(nSteps):
114
       # Create each plot on a separate pad
       plt.subplot(1, nSteps, i+1)
115
       # Plot the function we are trying to find the root of
117
       plt.plot(xList, fxList, "b-", lw=2, label=r' \$y=f(x)=\$s\$' % s.latex(F))
118
       # Add v=0
120
       plt.axhline(0, color="k", linestyle="--", label=r"$y=0$")
122
       # Plot the current and next roots
       plotRoot(xL, f(xL), cList[i], "L")
124
       plotRoot(xR, f(xR), cList[i], "R")
       plotRoot(x, f(x), cList[i+1], "")
       rootList.append(x)
       print("\tStep %d/%d, xL=%.3f, xR = %.3f, x = %.3f" % (i+1, nSteps, xL, xR,
       x))
129
       # Find the next root using Newton-Raphson
       x, xL, xR = bisection(f, xL, xR)
132
       # Customise axes
       plt.title(f'Step {i+1}')
134
       plt.xlabel('x')
       plt.ylabel('f(x)')
136
       plt.ylim(-4.0, 2.5)
       plt.legend(loc='lower right')
138
       plt.grid(True)
   plt.tight_layout()
   for ext in [".png", ".pdf"]:
       plt.savefig("ex4" + ext)
144
   # Create a figure with the roots
plt.figure(figsize=(16, 6))
plt.plot(bi_Roots, "ro-", lw=2, label=r'root $x_{n}$')
148 plt.axhline(realRoots[0], color="k", linestyle="--", label="exact root")
for i in range (nSteps+1):
plt.plot([i], bi_Roots[i], cList[i]+"o", label=r'$x_{%d}$' % (i))
```

```
plt.xlabel('step')
plt.ylabel(r'$x_{n}$')
plt.title("Bisection Method")
plt.grid(True)
plt.legend(loc='upper right', title=r'$N=%d, \epsilon=%.1e$' % (bi_Steps, epsilon))

for ext in [".png", ".pdf"]:
    plt.savefig("ex4-roots" + ext)
plt.show()
```

Αποτέλεσμα:

```
=== ex4.py
  Step 1, xL=1.750000, xR=3.000000, epsilon=6.250000e-01
  Step 2, xL=2.375000, xR=3.000000, epsilon=3.125000e-01
 Step 3, xL=2.375000, xR=2.687500, epsilon=1.562500e-01
  Step 4, xL=2.531250, xR=2.687500, epsilon=7.812500e-02
  Step 5, xL=2.531250, xR=2.609375, epsilon=3.906250e-02
  Step 6, xL=2.570312, xR=2.609375, epsilon=1.953125e-02
  Step 7, xL=2.589844, xR=2.609375, epsilon=9.765625e-03
  Step 8, xL=2.589844, xR=2.599609, epsilon=4.882812e-03
  Step 9, xL=2.589844, xR=2.594727, epsilon=2.441406e-03
  Step 10, xL=2.592285, xR=2.594727, epsilon=1.220703e-03
  Step 11, xL=2.593506, xR=2.594727, epsilon=6.103516e-04
  Step 12, xL=2.594116, xR=2.594727, epsilon=3.051758e-04
  Step 13, xL=2.594116, xR=2.594421, epsilon=1.525879e-04
  Step 14, xL=2.594269, xR=2.594421, epsilon=7.629395e-05
  Step 15, xL=2.594269, xR=2.594345, epsilon=3.814697e-05
  Step 16, xL=2.594307, xR=2.594345, epsilon=1.907349e-05
  Step 17, xL=2.594307, xR=2.594326, epsilon=9.536743e-06
  Step 18, xL=2.594307, xR=2.594316, epsilon=4.768372e-06
  Step 19, xL=2.594312, xR=2.594316, epsilon=2.384186e-06
  Step 20, xL=2.594312, xR=2.594314, epsilon=1.192093e-06
  Step 21, xL=2.594313, xR=2.594314, epsilon=5.960464e-07
  Step 22, xL=2.594313, xR=2.594314, epsilon=2.980232e-07
 Step 23, xL=2.594313, xR=2.594313, epsilon=1.490116e-07
=== ex4.py
 Found root to be '2.594' after 24 iterations!
=== ex4.py: Plot
 Step 1/3, xL=0.500, xR = 3.000, x = 1.750
 Step 2/3, xL=1.750, xR = 3.000, x = 2.375
 Step 3/3, xL=2.375, xR = 3.000, x = 2.688
```

