## **Problem set 8**

[Revised Feb 04, 9:31 PM]

## **Nonlinear problems**

1. You should complete the code in bisection.py to solve the following nonlinear problem

$$3x^3 = -2x^2 + 5x + 20$$

for *x* using the bisection method.

bisection.py contains two functions residual(x) and solve\_bisection(x\_min, x\_max, func).

- Write down (on paper) the nonlinear residual F(x) for this problem
- Modify bisection.py and insert the definition of the nonlinear residual within the function residual(x)

The following parts require you to edit solve\_bisection().

- Add the bisection criteria to shrink the search interval depending on whether  $F(x_{\text{left}})F(x^*) > 0$  or  $F(x_{\text{left}})F(x^*) < 0$ .
- $\circ$  Modify <code>solve\_bisection()</code> to include the following stopping conditions at iteration k
  - Stop if the absolute residual

$$|F(x_k)|$$

is 
$$< 10^{-12}$$

 Stop if the solution x is not improving between iterations. We do this by checking the relative error

$$\frac{|x_k-x_{k-1}|}{|x_k|}.$$

Change solve bisection() to stop iterating if the condition

$$|x_k - x_{k-1}| < 10^{-12} |x_k|$$

is met.

For all stopping conditions, use break to exit the bisection iteration loop, and report (using print()) which stopping condition was satisified and how many iterations were performed.

Finally, run bisection.py using the starting interval [1.0, 2.0] and report: (i) how many iterations were required to obtain a solution to F(x) = 0; (ii) the final solution x obtained.

- 2. We will solve the solve problem as in question 1 using Newton's method. You will edit functions within newton.py for this question.
  - The residual F(x) is the same as in Q1. Add the residual definition within residual (x).
  - Write down (on paper) the Jacobian of F(x).
  - Insert the definition of the Jacobian into the function jacobian(x).
  - Add the same stopping conditions as for Q1 into solve newton().

Finally, run [newton.py] using an initial guess [x0] = 8.0 and report: (i) how many iterations were required by Newton's method to obtain a solution to F(x) = 0; (ii) the final solution x obtained. Compare your answer with Q1. Discuss differences in the iterations required to converge, reason the iterations were terminated.

3. Write down (on paper) the Jacobaim for the following nonlinear problems

0

$$F_1(x_1, x_2) = x_1 + \exp(x_2) - 2$$
  

$$F_2(x_1, x_2) = x_2 + x_1^2$$

0

$$F_1(x_1, x_2) = x_1 - \frac{1}{2}x_1x_2 - 1$$
  

$$F_2(x_1, x_2) = x_2 + \frac{1}{2}x_1x_2 - 1$$

0

$$F_1(x_1, x_2) = x_1 - 2 \exp(-x_1 x_2)$$
  

$$F_2(x_1, x_2) = x_2 + \exp(-x_1 x_2) - 1$$

Hint: Use the approach described in class. That is first compute the directional directive of  $F(x^*)$  in the direction  $\delta x$ , then isolate the  $\delta x$  terms so that you have  $J(x^*)\delta x$ . Lastly you can replace  $x^*$  with x to yield J(x). Also recall

$$\mathbf{J}(\mathbf{x}^*)\delta\mathbf{x} = \nabla \mathbf{F}_{\mathbf{x}}(\mathbf{x}^*)\delta\mathbf{x}$$

can be computed with the following threes steps

- Insert  $\mathbf{x}^* + \epsilon \delta \mathbf{x}$  into the nonlinear residual, i.e. evaluate

$$\mathbf{F}(\mathbf{x}^* + \epsilon \delta \mathbf{x}).$$

- Then evaluate

$$\frac{d}{d\epsilon} \left[ \mathbf{F} (\mathbf{x}^* + \epsilon \delta \mathbf{x}) \right].$$

- Lastly evaluate

$$\left. \frac{d}{d\epsilon} \left[ \mathbf{F} (\mathbf{x}^* + \epsilon \delta \mathbf{x}) \right] \right|_{\epsilon=0}.$$

4. We will use Newton's method to solve the following system of nonlinear equations

$$\exp(x_2 - x_1) = 2.0$$

$$x_1 x_2 = -x_3$$

$$x_2 x_3 = -x_1^2 + x_2$$

for 
$$\mathbf{x} = (x_1, x_2, x_3)$$
.

A skeleton code is provided in newton\_system.py.

- $\circ$  Write down (on paper) the nonlinear residual  $\mathbf{F}(\mathbf{x})$
- Insert the definition of the residual in residual sys(x)
- Write down (on paper) the Jacobian of F(x).
- Insert the definition of the Jacobian in jacobian sys(x)
- $\circ$  We will stop the Newton iterations when the 2-norm of the nonlinear residual  $F_n$

$$F_n = ||\mathbf{F}||_2$$

is below some tolerance. Modify solve newton sys() to stop the iterations when

$$F_n < 10^{-12}$$

Finally, run  $[newton\_system.py]$  with the initial guess  $\mathbf{x}_0 = (0,0,0)$  and report: (i) how many iterations were required by Newton's method to obtain a solution to  $\mathbf{F}(\mathbf{x}) = \mathbf{0}$ ; (ii) the solution  $\mathbf{x}$  you obtained.