

# APPM 5720 Homework 2

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## 1 Newton's Method

The code in `newtonS.p` and `newtonS.f90.Template` performed Newton's method and a set of simple sample functions

$$\begin{aligned} f(x) &= e^x - 1, & g(x) &= x^2 \\ h(x) &= \sin(x), & r(x) &= e^{-1/x} \end{aligned}$$

where each function has a root at  $x = 0$ , save for  $r(x)$  which is undefined at 0 though

$$\lim_{x \rightarrow 0^+} r(x) = \lim_{x \rightarrow 0^+} e^{-1/x} = 0$$

We recall that Newton's method is quadratically convergent to a root, under the assumption that the root is simple and the derivative is itself not 0 at the root of interest (and the second derivative is bounded). Let us examine each function individually.

### 1.1 $e^x - 1$

This function meets the above assumptions for quadratic convergence. As such, it is observed that  $E_{n+1}/E_n^2$  approximately converges after four iterations.

Iteration	$E_{n+1}/E_n$	$E_{n+1}/E_n^2$
01	-0.6321205588285577E+00	-0.6321205588285577E+00
02	0.4869314375964384E+00	-0.7703141921199606E+00
03	0.1894444060136254E+00	-0.6154801567949590E+00
04	0.3031399383262888E-01	-0.5198686660785536E+00
05	0.8848598680903540E-03	-0.5005896024729687E+00
06	0.7820703579018673E-06	-0.5000099574951582E+00
07	0.0000000000000000E+00	-0.0000000000000000E+00

## 1.2 $f(x) = x^2$

We can see that this function has a double root at  $x = 0$ . The derivative of  $f(x)$  is 0 at  $x = 0$ . Thus, using the Newton's method, we would expect linear convergence instead of quadratic convergence. Implementation of Newton's method shows that the ratio of errors from adjacent time steps, i.e.  $E_{n+1}/E_n$  is a constant, i.e. the convergence is linear.

Iteration	$E_{n+1}/E_n$	$E_{n+1}/E_n^2$
01	-0.5000000000000000E+00	-0.5000000000000000E+00
02	0.5000000000000000E+00	-0.1000000000000000E+01
03	0.5000000000000000E+00	-0.2000000000000000E+01
04	0.5000000000000000E+00	-0.4000000000000000E+01
05	0.5000000000000000E+00	-0.8000000000000000E+01
06	0.5000000000000000E+00	-0.1600000000000000E+02
07	0.5000000000000000E+00	-0.3200000000000000E+02
08	0.5000000000000000E+00	-0.6400000000000000E+02
09	0.5000000000000000E+00	-0.1280000000000000E+03
10	0.5000000000000000E+00	-0.2560000000000000E+03
11	0.5000000000000000E+00	-0.5120000000000000E+03
12	0.5000000000000000E+00	-0.1024000000000000E+04
13	0.5000000000000000E+00	-0.2048000000000000E+04
14	0.5000000000000000E+00	-0.4096000000000000E+04
15	0.5000000000000000E+00	-0.8192000000000000E+04

The Newton's method calculates the root after the  $(k + 1)^{th}$  iteration by the iterative formula

$$x_{n+1} = x_n - \frac{f(x_n)}{f'(x_n)} \quad (1)$$

Since we know that the root is a double root, we try modifying the formula by multiplying a factor of 2 to the 2nd term, i.e.

$$x_{n+1} = x_n - 2 \frac{f(x_n)}{f'(x_n)} \quad (2)$$

This iterative formula ends up converging to the root  $x = 0$  immediately on the first iteration irrespective of our initial guess! Say our initial guess is  $x = x_0$ .

Then the first iteration would result in

$$\begin{aligned}x_1 &= x_0 - 2 \frac{f(x_0)}{f'(x_0)} \\&= x_0 - 2 \frac{x_0^2}{2x_0} \\&= 0\end{aligned}$$

as demonstrated by the code.

Iteration	$E_{n+1}/E_n$	$E_{n+1}/E_n^2$
01	-0.1000000000000000E+01	-0.1000000000000000E+01

### 1.3 $\sin(x)$

Because  $\sin(x)$  only has single roots, one would expect Newton's method to converge quadratically like normal. When the code was run, it produced:

Iteration	$E_{n+1}/E_n$	$E_{n+1}/E_n^2$
01	-0.1523676741017902E+01	-0.1523676741017902E+01
02	-0.3877900367215199E+00	0.2545093892175937E+00
03	-0.9689555030589873E-01	-0.1639888607225156E+00
04	-0.1090466714959705E-02	0.1904667166963419E-01
05	-0.1299242582583448E-08	-0.2081059578567191E-04
06	0.0000000000000000E+00	-0.0000000000000000E+00

Neither ratio converges to a constant. However, when we check for cubic convergence, we get the following result:

Iteration	$E_{n+1}/E_n$	$E_{n+1}/E_n^3$
01	-0.1523676741017902E+01	-0.1523676741017902E+01
02	-0.3877900367215199E+00	-0.1670363420049105E+00
03	-0.9689555030589873E-01	-0.2775395398051782E+00
04	-0.1090466714959705E-02	-0.3326792984270507E+00
05	-0.1299242582583448E-08	-0.3333333611137316E+00
06	0.0000000000000000E+00	0.0000000000000000E+00

As we can see,  $\frac{E_{n+1}}{E_n^3}$  converges quickly to a constant. This means that Newton's method converges cubically for  $f(x) = \sin(x)$ . This might be because the sine function is almost linear near roots ( $f''(x) = -\sin(x) = -f(x) = 0$  when  $f(x) = 0$ ), so this should help speed up the convergence rate.

# 1.4 $e^{-1/x}$

Iteration	$E_{n+1}/E_n$	$E_{n+1}/E_n^2$
01	-0.100000000000000E-03	-0.100000000000000E-03
02	0.980100000000000E+00	-0.980100000000000E+04
03	0.980298009999999E+00	-0.1000202030405060E+05
04	0.9804920990079601E+00	-0.1020506060403061E+05
05	0.9806823827241055E+00	-0.1041012070006161E+05
06	0.9808689723299778E+00	-0.1061720039624038E+05
07	0.9810519747073182E+00	-0.1082629950052112E+05
08	0.9812314926443280E+00	-0.1103741782460229E+05
09	0.9814076250301539E+00	-0.1125055518381782E+05
10	0.9815804670383682E+00	-0.1146571139703251E+05
11	0.9817501103001732E+00	-0.1168288628654150E+05
12	0.9819166430679892E+00	-0.1190207967797336E+05
13	0.9820801503700450E+00	-0.1212329140019697E+05
14	0.9822407141565502E+00	-0.1234652128523173E+05
15	0.9823984134379694E+00	-0.1257176916816113E+05