lecture_07

February 6, 2017

```
In [1]: %plot --format sug
In [2]: setdefaults
```

1 Roots: Open methods

1.1 Newton-Raphson

First-order approximation for the location of the root (i.e. assume the slope at the given point is constant, what is the solution when f(x)=0)

```
f'(x_i) = \frac{f(x_i) - 0}{x_i - x_{i+1}}x_{i+1} = x_i - \frac{f(x_i)}{f'(x_i)}
```

Use Newton-Raphson to find solution when $e^x = x$

```
In [20]: f = 0(x) \exp(-x) - x;
         df = 0(x) - exp(-x)-1;
         x_i = 0;
         error_approx = abs((x_r-x_i)/x_r)
         x_r=x_i;
error_approx = 1
In [21]: x_r = x_i-f(x_i)/df(x_i)
         error_approx = abs((x_r-x_i)/x_r)
         x_i=x_r;
x_r = 0.50000
error_approx = 1
In [22]: x_r = x_i-f(x_i)/df(x_i)
         error_approx = abs((x_r-x_i)/x_r)
         x_i=x_r;
x_r = 0.56631
error_approx = 0.11709
```

In the bungee jumper example, we created a function f(m) that when f(m)=0, then the mass had been chosen such that at t=4 s, the velocity is 36 m/s.

$$f(m) = \sqrt{\frac{gm}{c_d}} \tanh(\sqrt{\frac{gc_d}{m}}t) - v(t).$$

to use the Newton-Raphson method, we need the derivative $\frac{df}{dm}$

$$\frac{df}{dm} = \frac{1}{2} \sqrt{\frac{g}{mc_d}} \tanh(\sqrt{\frac{gc_d}{m}} t) - \frac{g}{2m} \mathrm{sech}^2(\sqrt{\frac{gc_d}{m}} t)$$

In [7]: setdefaults

```
g=9.81; % acceleration due to gravity
m=linspace(50, 200,100); % possible values for mass 50 to 200 kg
c_d=0.25; % drag coefficient
t=4; % at time = 4 seconds
v=36; % speed must be 36 m/s
f_m = @(m) sqrt(g*m/c_d).*tanh(sqrt(g*c_d./m)*t)-v; % anonymous function f_m
df_m = @(m) 1/2*sqrt(g./m/c_d).*tanh(sqrt(g*c_d./m)*t)-g/2./m*sech(sqrt(g*c_d./m)*t).^2;
```

In [8]: newtraph(f_m,df_m,140,0.00001)

ans = 142.74

1.2 Secant Methods

Not always able to evaluate the derivative. Approximation of derivative:

$$f'(x_i) = \frac{f(x_{i-1}) - f(x_i)}{x_{i-1} - x_i}$$

$$x_{i+1} = x_i - \frac{f(x_i)}{f'(x_i)}$$

$$x_{i+1} = x_i - \frac{f(x_i)}{\frac{f(x_{i-1}) - f(x_i)}{x_{i-1} - x_i}} = x_i - \frac{f(x_i)(x_{i-1} - x_i)}{f(x_{i-1}) - f(x_i)}$$
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What values should x_i and x_{i-1} take?

To reduce arbitrary selection of variables, use the

1.3 Modified Secant method

Change the x evaluations to a perturbation δ .

$$x_{i+1} = x_i - \frac{f(x_i)(\delta x_i)}{f(x_i + \delta x_i) - f(x_i)}$$

In [9]: mod_secant(f_m, 1e-6, 50, 0.00001)

ans = 142.74

Amortization calculation makes the same calculation for the monthly payment amount, A, paying off the principle amount, P, over n pay periods with monthly interest rate, r.

1.4 Matlab's function

Matlab and Octave combine bracketing and open methods in the fzero function.

```
In [13]: help fzero
'fzero' is a function from the file /usr/share/octave/4.0.0/m/optimization/fzero.m
-- Function File: fzero (FUN, X0)
-- Function File: fzero (FUN, X0, OPTIONS)
-- Function File: [X, FVAL, INFO, OUTPUT] = fzero (...)
    Find a zero of a univariate function.

FUN is a function handle, inline function, or string containing the name of the function to evaluate.

X0 should be a two-element vector specifying two points which bracket a zero. In other words, there must be a change in sign of the function between X0(1) and X0(2). More mathematically, the following must hold
```

```
sign (FUN(XO(1))) * sign (FUN(XO(2))) <= 0
```

If XO is a single scalar then several nearby and distant values are probed in an attempt to obtain a valid bracketing. If this is not successful, the function fails.

OPTIONS is a structure specifying additional options. Currently, 'fzero' recognizes these options: "FunValCheck", "OutputFcn", "TolX", "MaxIter", "MaxFunEvals". For a description of these options, see *note optimset: XREFoptimset.

On exit, the function returns X, the approximate zero point and FVAL, the function value thereof.

INFO is an exit flag that can have these values:

- * 1 The algorithm converged to a solution.
- * 0 Maximum number of iterations or function evaluations has been reached.
- * -1 The algorithm has been terminated from user output function.
- * -5 The algorithm may have converged to a singular point.

OUTPUT is a structure containing runtime information about the 'fzero' algorithm. Fields in the structure are:

- * iterations Number of iterations through loop.
- * nfev Number of function evaluations.
- * bracketx A two-element vector with the final bracketing of the zero along the x-axis.
- * brackety A two-element vector with the final bracketing of the zero along the y-axis.

See also: optimset, fsolve.

Additional help for built-in functions and operators is available in the online version of the manual. Use the command 'doc <topic>' to search the manual index.

Help and information about Octave is also available on the WWW at http://www.octave.org and via the help@octave.org mailing list.

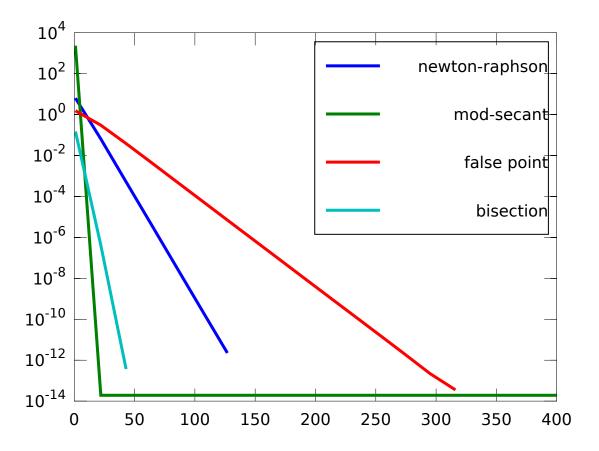
```
In [14]: fzero(@(A) car_payments(A,30000,0.05,5,0),500)
ans = 563.79
```

1.5 Comparison of Solvers

It's helpful to compare to the convergence of different routines to see how quickly you find a solution.

Comparing the freefall example

```
In [15]: N=20;
         iterations = linspace(1,400,N);
         ea_nr=zeros(1,N); % appr error Newton-Raphson
         ea_ms=zeros(1,N); % appr error Modified Secant
         ea_fp=zeros(1,N); % appr error false point method
         ea_bs=zeros(1,N); % appr error bisect method
         for i=1:length(iterations)
             [root_nr,ea_nr(i),iter_nr] = newtraph(f_m,df_m,200,0,iterations(i));
             [root_ms,ea_ms(i),iter_ms]=mod_secant(f_m,1e-6,300,0,iterations(i));
             [root_fp,ea_fp(i),iter_fp]=falsepos(f_m,1,300,0,iterations(i));
             [root_bs,ea_bs(i),iter_bs]=bisect(f_m,1,300,0,iterations(i));
         end
         semilogy(iterations,abs(ea_nr),iterations,abs(ea_ms),iterations,abs(ea_fp),iterations,abs(ea_fp)
         legend('newton-raphson','mod-secant','false point','bisection')
warning: axis: omitting non-positive data in log plot
warning: called from
    __line__ at line 120 column 16
    line at line 56 column 8
    __plt__>__plt2vv__ at line 500 column 10
    __plt__>__plt2__ at line 246 column 14
    __plt__ at line 133 column 15
    semilogy at line 60 column 10
warning: axis: omitting non-positive data in log plot
warning: axis: omitting non-positive data in log plot
warning: axis: omitting non-positive data in log plot
```



In [16]: ea_ms

 $ea_ms =$

Columns 1 through 6:

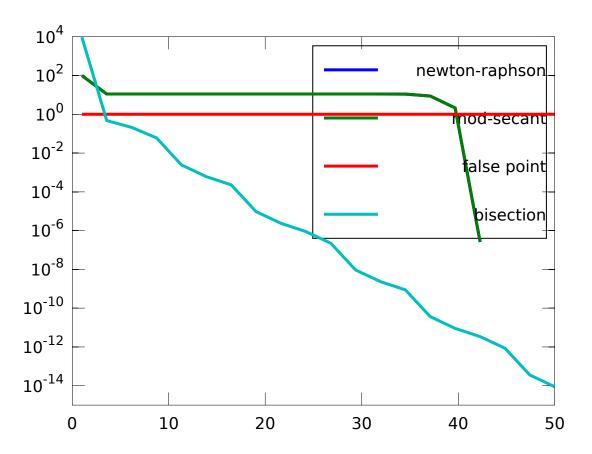
2.3382e+03 1.9171e-14 1.9171e-14 1.9171e-14 1.9171e-14 1.9171e-14 Columns 7 through 12:

1.9171e-14 1.9171e-14 1.9171e-14 1.9171e-14 1.9171e-14 1.9171e-14 Columns 13 through 18:

1.9171e-14 1.9171e-14 1.9171e-14 1.9171e-14 1.9171e-14 1.9171e-14 Columns 19 and 20:

1.9171e-14 1.9171e-14

```
In [17]: N=20;
         f = 0(x) x^10-1;
         df=@(x) 10*x^9;
         iterations = linspace(1,50,N);
         ea_nr=zeros(1,N); % appr error Newton-Raphson
         ea_ms=zeros(1,N); % appr error Modified Secant
         ea_fp=zeros(1,N); % appr error false point method
         ea_bs=zeros(1,N); % appr error bisect method
         for i=1:length(iterations)
             [root_nr,ea_nr(i),iter_nr] = newtraph(f,df,0.5,0,iterations(i));
             [root_ms,ea_ms(i),iter_ms]=mod_secant(f,1e-6,0.5,0,iterations(i));
             [root_fp,ea_fp(i),iter_fp]=falsepos(f,0,5,0,iterations(i));
             [root_bs,ea_bs(i),iter_bs]=bisect(f,0,5,0,iterations(i));
         end
         semilogy(iterations,abs(ea_nr),iterations,abs(ea_ms),iterations,abs(ea_fp),iterations,abs(ea_fp)
         legend('newton-raphson','mod-secant','false point','bisection')
warning: axis: omitting non-positive data in log plot
warning: called from
    __line__ at line 120 column 16
    line at line 56 column 8
    __plt__>__plt2vv__ at line 500 column 10
    __plt__>__plt2__ at line 246 column 14
    __plt__ at line 133 column 15
    semilogy at line 60 column 10
warning: axis: omitting non-positive data in log plot
warning: axis: omitting non-positive data in log plot
warning: axis: omitting non-positive data in log plot
```



ea_bs =

Columns 1 through 6:

9.5357e+03 -4.7554e-01 -2.1114e-01 6.0163e-02 -2.4387e-03 6.1052e-04

Columns 7 through 12:

2.2891e-04 -9.5367e-06 2.3842e-06 8.9407e-07 -2.2352e-07 9.3132e-09
Columns 13 through 18:

-2.3283e-09 -8.7311e-10 3.6380e-11 -9.0949e-12 -3.4106e-12 8.5265e-13 Columns 19 and 20:

-3.5527e-14 8.8818e-15

```
ans = 16.208
In [19]: df(300)
ans = 1.9683e+23
In []:
```