

## C: Solving equations

Very frequent task in numerical analysis:

Given a function  $f(x)$

Find an  $x^*$  such that  $f(x^*) = 0$

Some examples:

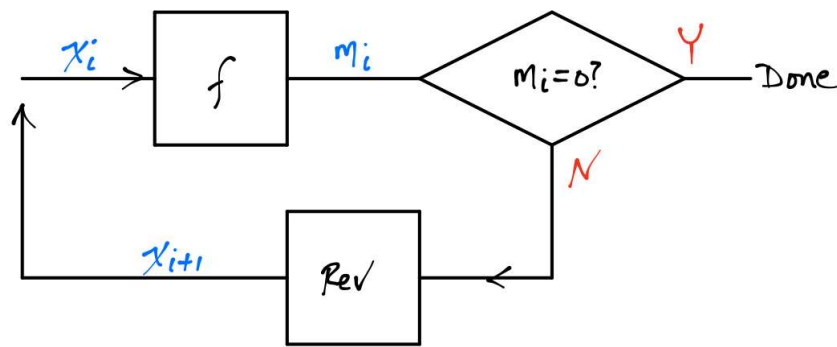
- IRR calculation:  
Find an  $r^*$  such that  $NPV(r^*) = 0$
- Market equilibrium:  
Find a price  $p^*$  such that  $Q^D(p^*) - Q^S(p^*) = 0$
- Carbon tax  $t^*$  to reduce emissions to a target level
- Clean energy credit  $c^*$  that causes renewable electricity to hit 50%
- Low income tax credit  $z^*$  to eliminate regressivity of a tax
- ... many, many more

Core technique is Newton's Method:

Iterative process:

1. At trial  $i$  guess  $x_i$
2. Evaluate  $f$  at the guess to find "miss distance"  $m_i: f(x_i) = m_i$
3. If  $m_i$  isn't 0, revise the guess to  $x_{i+1}$  and try again

Schematically:

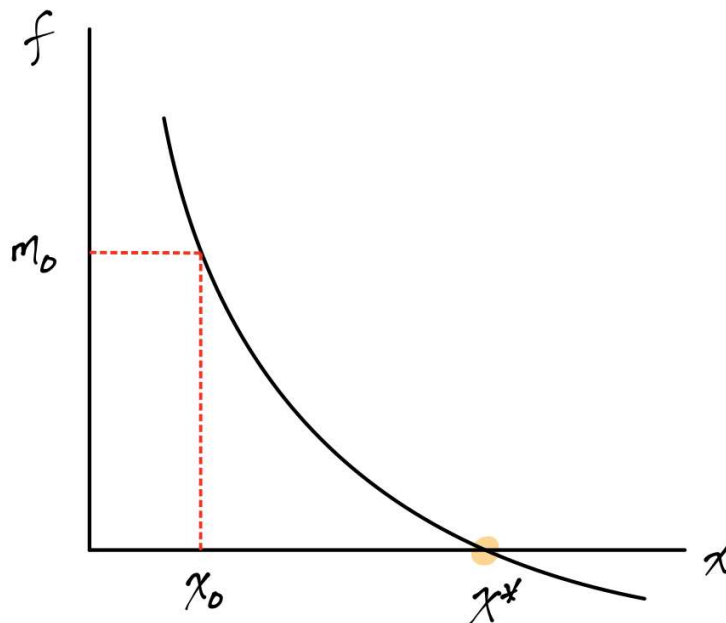


Heart of Newton's Method is the revision procedure:

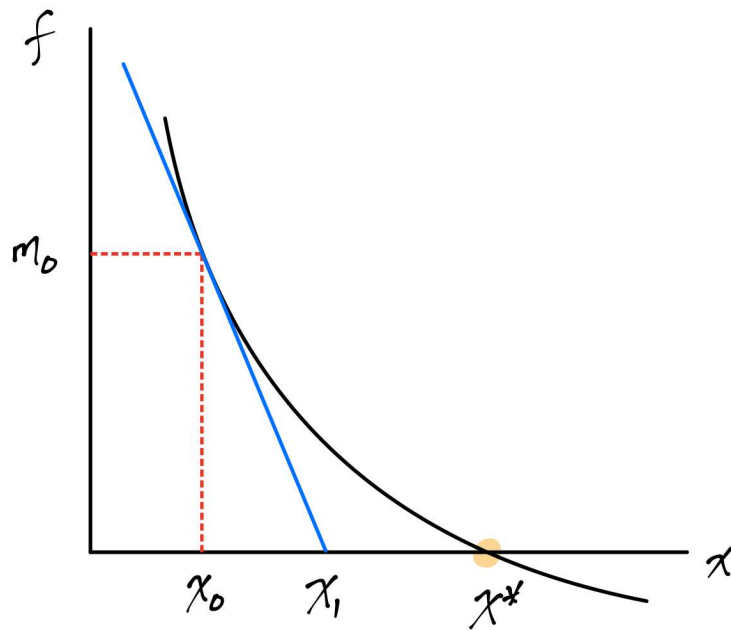
- Uses the slope of the function at  $x_i$
- Very fast in a wide range of cases

Graphically:

Initial guess and miss distance:



Using the slope of the function to find a new guess:



Why try this?

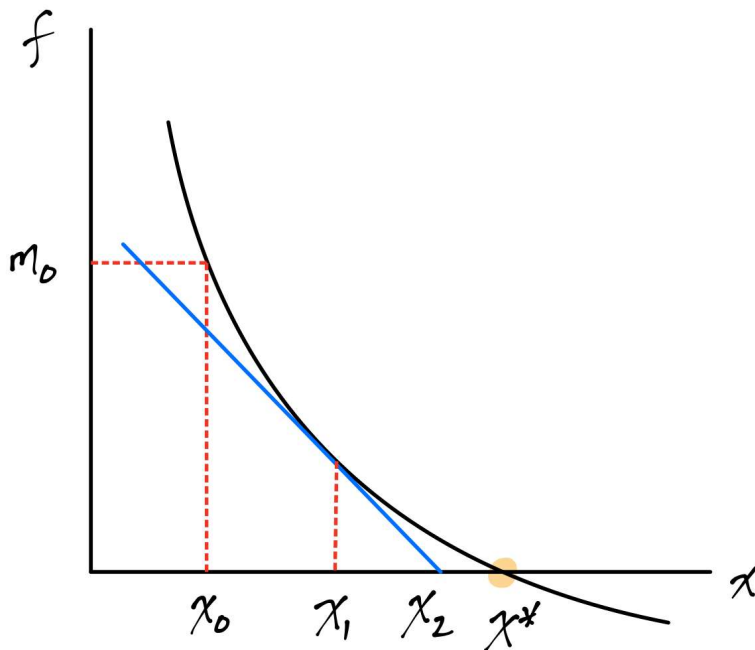
Hits  $x^*$  on the first try if  $f$  is linear

Still makes a big improvement for many other functions.

Algebraically, if the slope at  $x_0$  is  $s_0$ , can show:

$$x_1 = x_0 - \frac{m_0}{s_0}$$

Updating  $x$ ,  $m$  and  $s$  and generating a new guess:



Next guess:

$$x_2 = x_1 - \frac{m_1}{s_1}$$

Repeat until  $f(x_i) = 0$

### Outline of invoking Newton in Python:

1. Import the scipy module
2. Define a miss distance function
3. Create a starting guess
4. Call the scipy Newton's Method function; will return  $x^*$

In code:

```

1  import scipy.optimize as opt

2  def miss_func( guess, ... ):
    ...
    return miss

3  start_guess = ...

4  sol = opt.newton( miss_func, start_guess, ... )

```

Variable sol will be the solution  $x^*$

### Minor complication: passing additional variables to the miss function

The miss function usually takes *several arguments*:

Example: `npv( r, cashflow )`

`opt.newton()` iterates over guesses of the **first argument**

Example: `r`

To pass **additional arguments** give them as a list via optional parameter `args`:

`opt.newton( ..., args=[cashflow])`

Additional arguments are not altered by `opt.newton()`