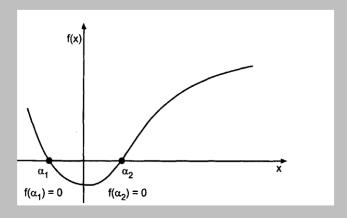
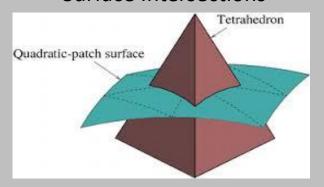
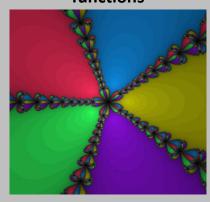
#### **Roots of Nonlinear Functions**



#### **Surface Intersections**



#### Fractals in use of Newton Method for complex functions

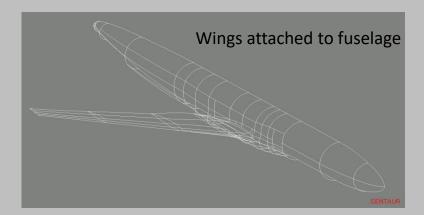


# <u>MatLab</u>

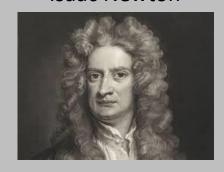
root = fzero('
$$f(x)$$
',  $x_o$ )  
root = fzero(@ $f(x)$ , [ $x_2$ ,  $x_1$ ])

With  $c \rightarrow$  coefficient vector for polynomial equation

$$\alpha = \text{roots}(c)$$

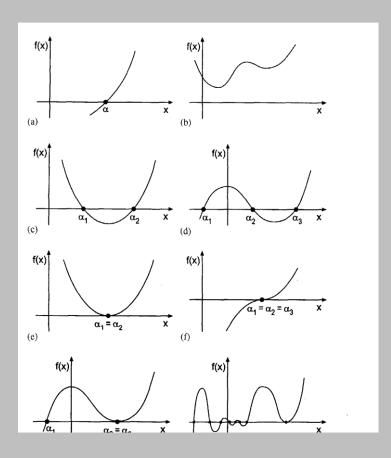


Isaac Newton



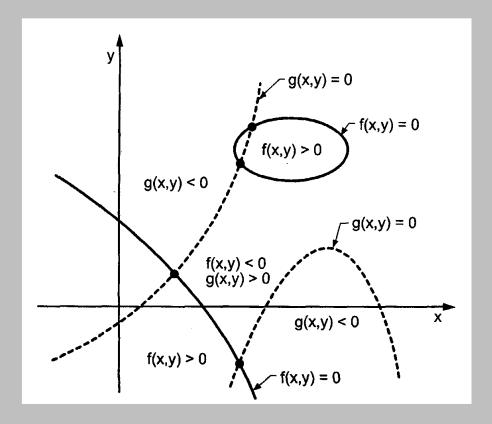
#### **Roots of Nonlinear Functions**

For function f(x), find  $\alpha$  such that  $f(\alpha) = 0$  and with this condition,  $\alpha$  is the root of f.



## Remarks

- f(x) is "smooth", finding  $\alpha$ 's will be straight forward, and convergence will be fast.
- If  $\alpha$  is repeated or complex, convergence is slow or nonexistent.
- If  $\alpha$  is sparse, finding all roots will be a difficult task.



#### Intersection of two functions

With two arbitrary functions f(x) and g(x), their intersection(s) can be found according to

$$h(x) = f(x) - g(x) = 0$$

Roots of h(x) are be intersections of f(x) and g(x).

## Optimization or an Infection Point at x

To maximize or minimize f(x)

$$f'(x) = 0$$

At infection point

$$f''(x) = 0$$

- With root finding, these points can be determined
- Discrete differentiation will be covered later

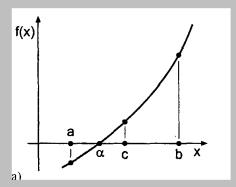
# Root finding Methods-Iterations

- Open domain or closed domain
- Bounded or unbounded
- Initial guess
- Real or Complex roots
- One or two-point method
- Convergence time and convergence criteria

# Two-point Closed Method

- Bisection
- False Position Method

#### **Bisection** method



- For f(x) = 0, points a and b are f(b) > 0 and f(a) < 0, such that f(a)f(b) < 0.
- Distance between a and b is (b-a). Compute point c with  $c=\frac{b-a}{2}$
- Determine f(c). If

$$f(a)f(c) < 0.$$
 take  $b = c$   
 $f(a)f(c) > 0$  take  $a = c$ 

- Iterate with new a and b and find new c until desired convergence.
- Number of iterations (?)

# **False Position Method**

For two points at a and b, set a straight line passing through these two points. Find intersection of line with x axis.

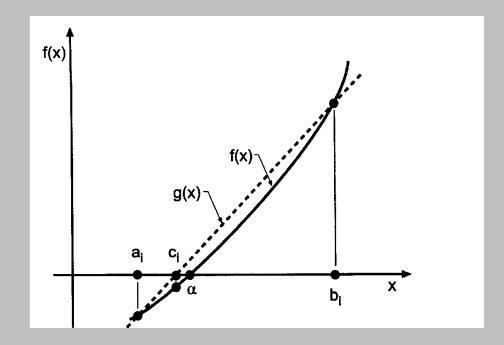
The straight line can be defined as

$$y = f(a) + \frac{y_a - y_b}{a - b} (a - x)$$

At line intersection with axis x, set y = 0 and x = c:

$$c = a - \frac{y_a(a-b)}{y_b - y_a}$$

From f(a)f(c) < 0, you can iterate like Bisection method.



### **Open Domain Iteration**

- Fixed point method
- Newton's method
- Secant method
- Muller's method

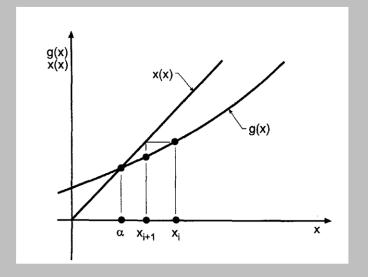
## Fixed point method

For f(x) = 0, define a function g(x) such that f(x) = x - g(x)

At root, then x - g(x) = 0 or x = g(x)

For iterations, this equality is modified to  $x_{k+1} = g(x_k)$ 

Start with  $x_o$ , and  $x_1 = g(x_o)$ , and continue until convergence.



# **Convergence Criterion**

Differentiate x = g(x) with x1 = g'(x)

Convergence when |g'(x)| < 1

For roots of function  $f(x) = x^2 - 3x + e^x - 2$ 

Determine g(x) and g'(x)

#### **Newton's Method**

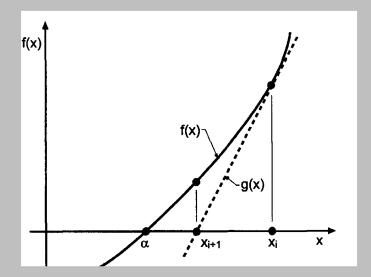
$$f'(x) = \frac{f(x_{i+1}) - f(x_i)}{x_{i+1} - x_i}$$

Set  $f(x_{i+1}) = 0$  and solve for  $x_{i+1}$ 

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

#### Convergence

$$|\Delta x_i| = |x_{i+1} - x_i| < \varepsilon$$



- o f'(x) exist in the calculation domain
- o  $f'(x) \neq 0$ , if  $f'(x) \rightarrow 0$ , convergence slow as root is double
- o f'(x) is changing sign. Oscillations in calculations and slow convergence.
- o f(x) is defined discretely and not analytically. Define incremental distance  $h=10^{-3}$  or smaller,
- $\circ$  and determine f'

$$f'(x_i) = \frac{f(x_i + h) - f(x)}{h}$$

o f'(x) can be approximated from two points  $x_1$  and  $x_2$ 

$$f'(x) = \frac{f(x_2) - f(x_{1)}}{x_2 - x_1}$$

Error estimation

$$e_i = \alpha - x_i \qquad e_{i+1} = O(e_i^2)$$

For roots of function  $f(x) = x^2 - 3x + e^x - 2$ 

## **Imaginary Roots**

In Newton's method, starting initial point is complex

$$x^o = a + ib$$

# Double and Multiple Roots

With *m* repeated roots

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

With this modification, Newton's method converges as  $e_i^2$ , as opposed to  $e_i$ 

Using Newton's method