

# **1.00 Tutorial 9**

**Matrices, Integration, Root Finding**

# Matrices & Linear Systems

- Matrices often used to represent a set of linear equations
- Matrix  $\mathbf{A}$  and right-hand side  $b$  are known
- $n$  unknowns  $x$  related to each other by  $m$  equations

$$\begin{aligned} a_{00}x_0 + a_{01}x_1 + a_{02}x_2 + \dots + a_{0,n-1}x_{n-1} &= b_0 \\ a_{10}x_0 + a_{11}x_1 + a_{12}x_2 + \dots + a_{1,n-1}x_{n-1} &= b_1 \\ \dots \\ a_{m-1,0}x_0 + a_{m-1,1}x_1 + a_{m-1,2}x_2 + \dots + a_{m-1,n-1}x_{n-1} &= b_{m-1} \end{aligned}$$

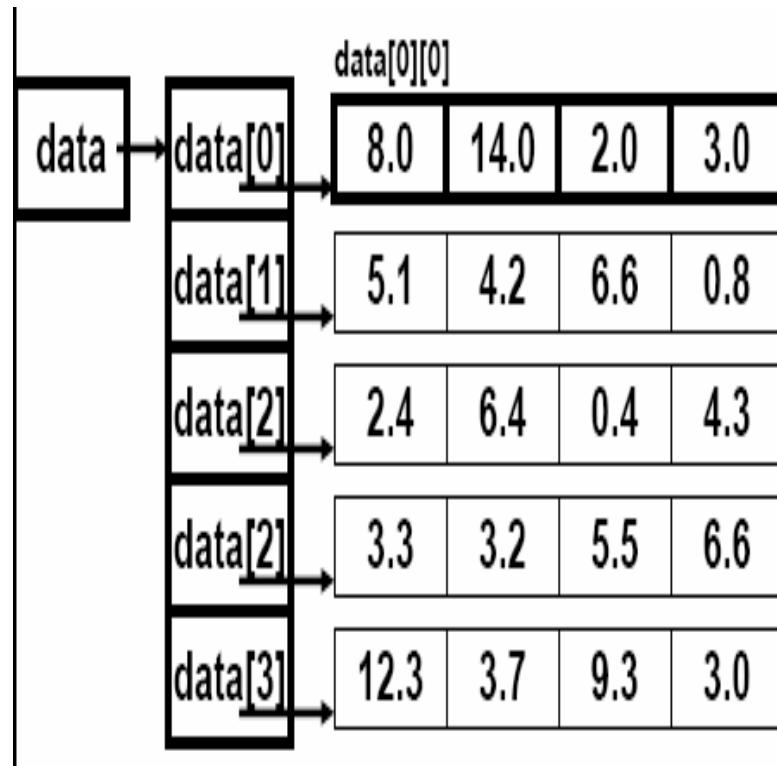
$$\left| \begin{array}{cccccc} a_{00} & a_{01} & a_{02} & a_{03} & \dots & a_{0,n-1} \\ a_{10} & a_{11} & a_{12} & a_{13} & \dots & a_{1,n-1} \\ a_{20} & a_{21} & a_{22} & a_{23} & \dots & a_{2,n-1} \\ \dots & \dots & \dots & \dots & \dots & \dots \\ a_{m-1,0} & a_{m-1,1} & a_{m-1,2} & a_{m-1,3} & \dots & a_{m-1,n-1} \end{array} \right| \left| \begin{array}{c} x_0 \\ x_1 \\ x_2 \\ \dots \\ x_{n-1} \end{array} \right| = \left| \begin{array}{c} b_0 \\ b_1 \\ b_2 \\ \dots \\ b_{m-1} \end{array} \right|$$

( $m$  rows x  $n$  cols)                          ( $n \times 1$ ) = ( $m \times 1$ )

$$\mathbf{Ax=b}$$

# Matrix Representation

- Create Matrix classes and have methods for adding, subtracting, multiplying, forming identity matrix etc.
- A 2-D array is a reference to a 1-D array of references to 1-D arrays of data. This is how matrix data is stored in class Matrix.



# Traversing 2D Arrays

- Say `double[][] data = new double[M][N]`
- `data.length` = number of rows ( $M$ )
- `data[0].length` = number of columns ( $N$ )
- Typical operation accessing all elements of a Matrix

```
for(int i = 0; i < data.length; i++) {  
    for(int j = 0; j < data[0].length; j++) {  
        // Do something here  
    }  
}
```

# Matrix exercise

- Add an instance method in the `Matrix` class to extract a  $M \times N$  submatrix of a given matrix starting at position  $(I, J)$
- If the input is invalid (section too large, etc.), return null
- Use `Matrix.java`, `MatrixTest.java`

# Numerical Integration & Root Finding

- Packaging mathematical functions as objects
  - In some languages methods can be passed around as arguments
    - In C and C++ done using “Function Pointers”
  - Java does not directly allow this, so we have to fake it: wrap the method inside a class or interface
  - So, instead of writing a method called `max` and passing it around by name, write a class that has a `max` method, and pass around objects of that class.
- It's good practice to have classes that represent functions implement a common interface
  - Why? Suppose we have an algorithm that is general to all 1-D functions, we need to implement it *only once* – makes code maintainable and portable

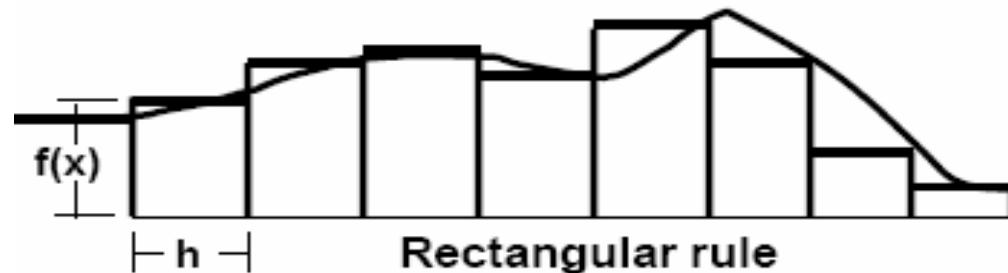
# Numerical Integration

- Basic problem: Given  $f(x)$ , evaluate

$$F = \int_{x=a}^{x=b} f(x) dx$$

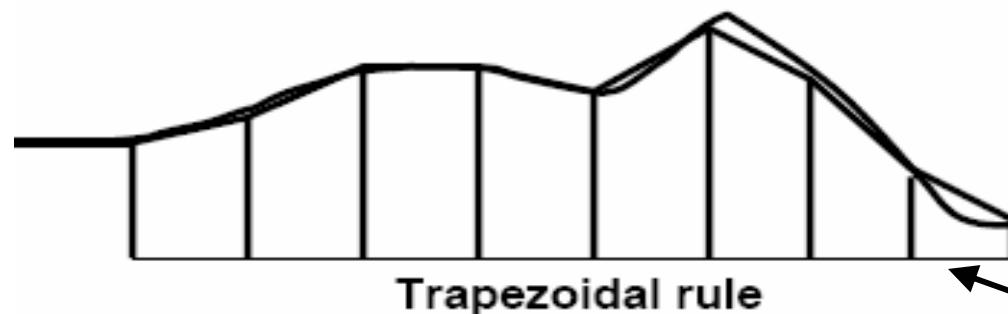
- Approaches:
  - Monte Carlo: Sample  $[a,b]$  randomly, add up function values at each sampled point, divide by  $b-a$ .
    - Woefully inaccurate !! Needs a large number of samples
  - Rectangular/Trapezoidal/Simpson's: Approximate  $f$  using piecewise constant, linear, parabolic segments and integrate each segment individually
  - More “elite” algorithms like Gauss quadrature

# Numerical Integration



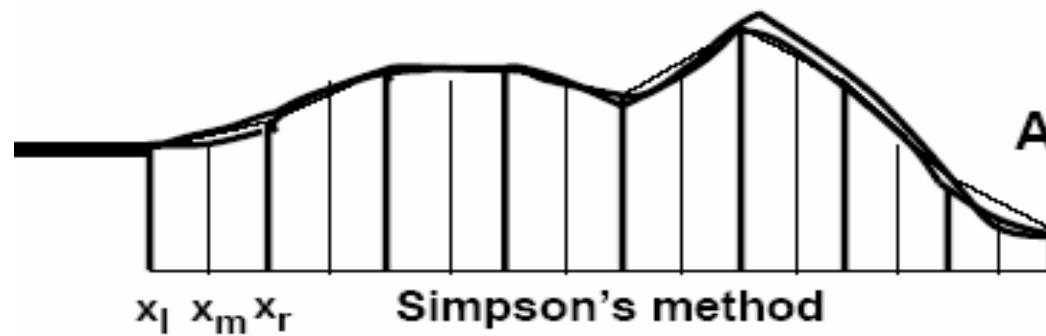
$$A = f(x_{\text{left}}) * h$$

Almost never used



$$A = (f(x_{\text{left}}) + f(x_{\text{right}})) * h / 2$$

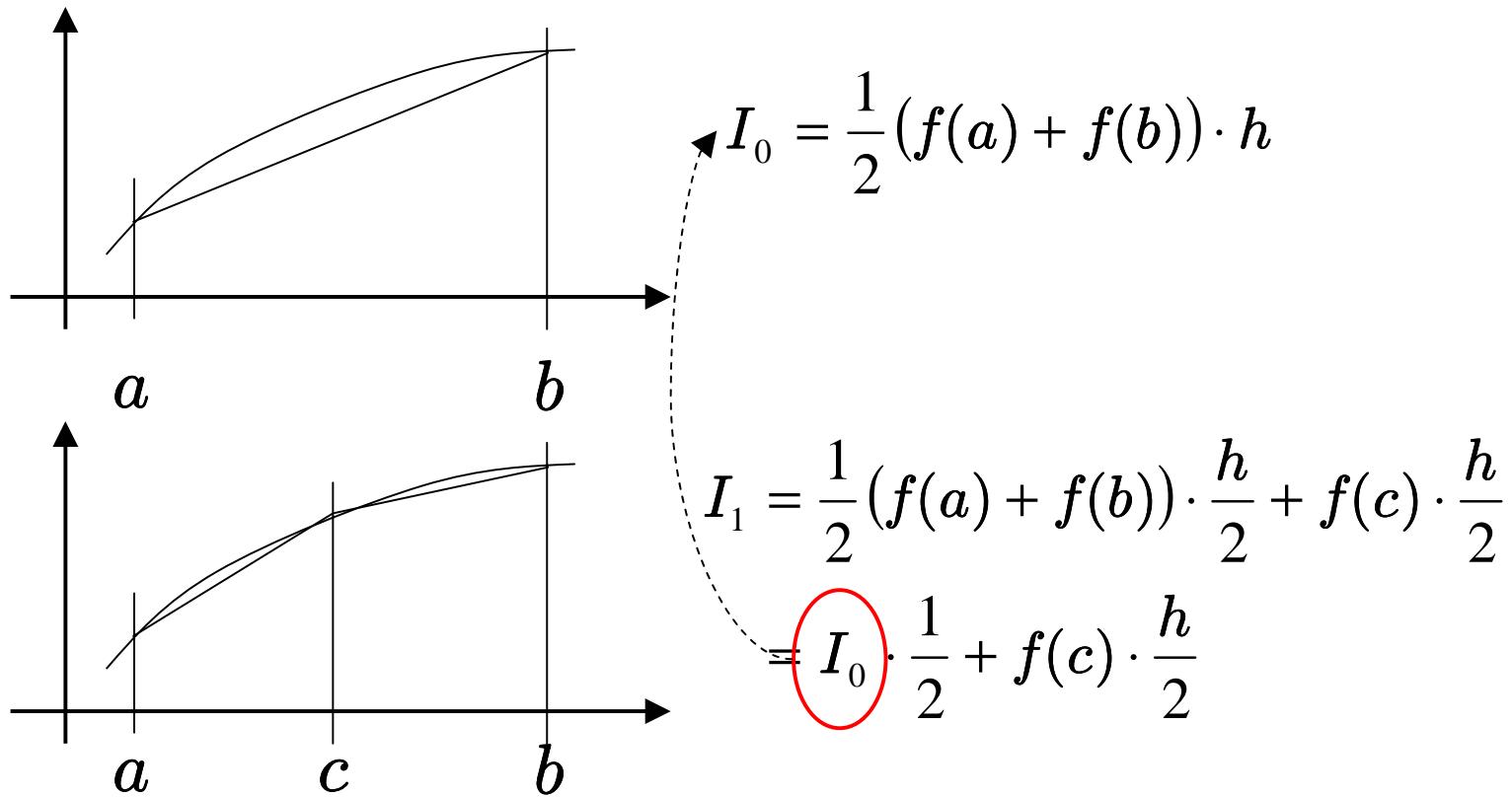
Use fancier version covered in the lecture



$$A = (f(x_l) + 4f(x_m) + f(x_r)) * h / 6$$

# Improved Trapezoidal Rule

- Basic Idea: Divide and Conquer



- Hence, to compute integral at one subdivision, need to know integral at previous subdivision – therefore need to call `trapzd` multiple times  
(Can use recursion instead of a `for` loop)

# Integration Exercise

- Compute PI using “fancy” Trapezoidal rule
  - Recall calling convention !
  - Why not using the regular Trapezoidal rule?
    - Hint: More accurate? Fewer operations? Recommended by TA?

$$\pi = \int_{x=0}^{x=1} \frac{4}{1+x^2} dx$$

- Implement MathFunction in **FuncPI.java**
- Complete main() in **ComputePI.java**
- How accurate is your estimate? How does it converge with the number of intervals?

# Root Finding Methods

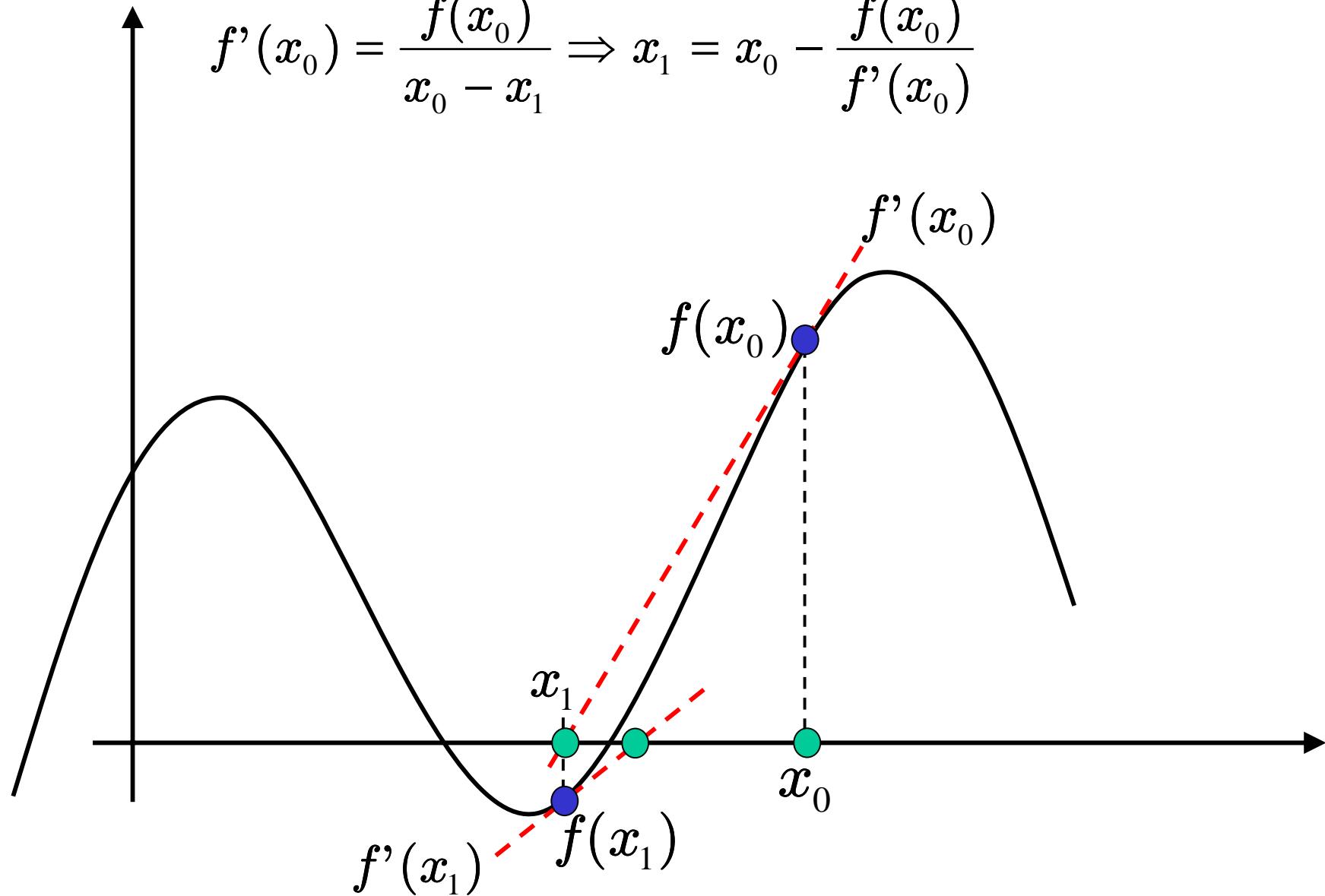
Two major types:

- **Bracketing methods:** solution must be known to lie in a particular interval. Always converge to the value of a root in that case.
  - Bisection, False Position
- **Open methods:** use one or more initial guesses, but it's not necessary to know the interval in which a solution lies. Not guaranteed to converge to a solution.
  - Fixed point iteration, Secant, Newton-Raphson

# Newton-Raphson

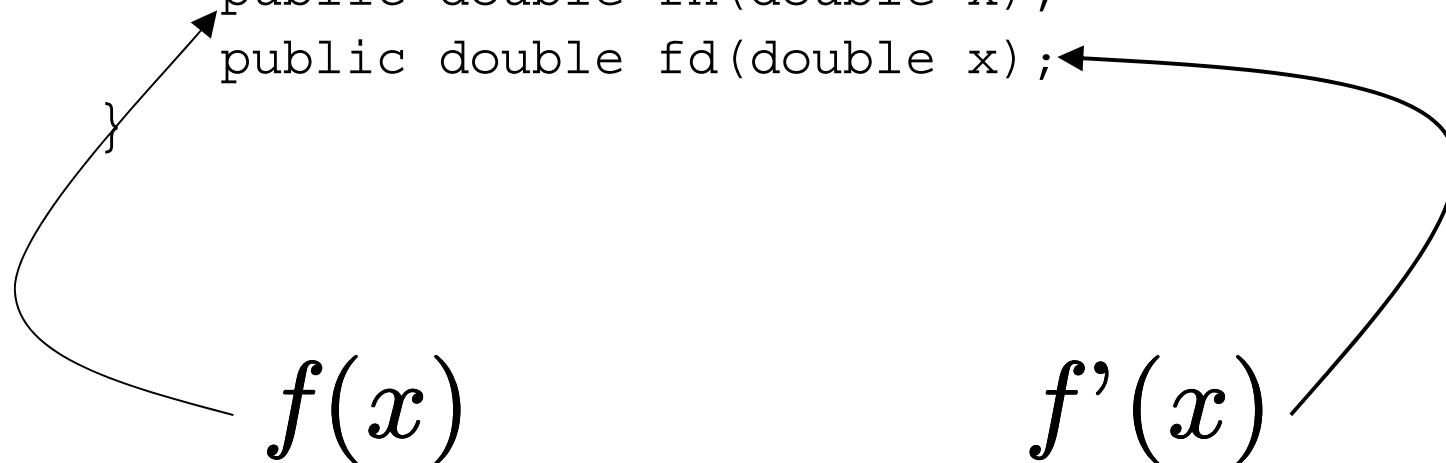
- & Only one initial guess needed: no bracketing
- & For 1D functions, new guess  $x_{\text{new}}$  is the 0-crossing of a tangent line from  $(x_{\text{old}}, f(x_{\text{old}}))$ . This requires the derivative of  $f(x)$ . For >1D functions all first order partial derivatives required.
- & Usually converges quickly, oscillating around solution, provided initial guess is good
- & Requires change of interface for functions to be solved by Newton's method... what change, and why?

$$f'(x_0) = \frac{f(x_0)}{x_0 - x_1} \Rightarrow x_1 = x_0 - \frac{f(x_0)}{f'(x_0)}$$



# Interface for functions solved using Newton-Raphson

```
public interface MathFunction2 {  
    public double fn(double x);  
    public double fd(double x);
```



# Root Finding Exercise

- When is  $x = \cos(x)$  ?
- Implement MathFunction2 in  
**NewtonFunc.java**
- Complete the main() method in  
**NewtonTest.java**
- How many Newton iterations does it take? What is the final error in the root?
- Optional Exercise: Compare with Bisection/Fixed point iteration

# PS 8: Numerical Methods

- Numerical integration (Sailboat Mast)

- Given

$$f(z) = 200 \left( \frac{z}{z + 5} \right) e^{-2z/30}$$

- Need to compute

$$F = \int_0^{30} f(z) dz \quad d = \frac{\int_0^{30} z f(z) dz}{\int_0^{30} f(z) dz}$$

- Use Rectangular, Trapezoidal and Simpson's rules
  - Treat Simpson's rule as accurate and see how much the other methods differ from it.

# Approach

- Write two classes implementing `MathFunction`, one for  $f(z)$  and other for  $z^*f(z)$
- In the main method, for each of the three integration schemes, evaluate  $f(z)$  and  $z^*f(z)$  by passing the classes you implemented to the respective integration methods
- For Rectangle rule , use `Integration.Rect` in file `Integration.java`
- For Trapezoidal rule, use `Trapezoid.trapzd` in file `Trapezoidal.java` [**remember calling convention!**]
- For Simpson's rule, use `Simpson.qsimp` in file `Simpson.java`

# PS 8: Numerical Methods

- Root finding (Open channel flow)

- Find a  $d$  such that

$$f(d) = \frac{\sqrt{s}}{n} \left( \frac{(dw)^{5/3}}{(d + 2w)^{2/3}} \right) - Q = 0$$

- Use bisection and Newton iterations
    - Need to modify `RootFinder.rtbis` and `Newton.newt` to output the number of iterations
  - Key problems
    - Implementing  $f(d)$
    - Validating the input (Cannot have negative values!)
    - Reasonable choices for initial guesses ??

# Approach

- Implement MathFunction (for bisection) and MathFunction2 (for Newton)
  - Hint: Can write *one* class implementing *both* interfaces (cf. multiple inheritance)
  - Expressions given in the pset
- In the main ( ) method:
  - Get inputs from using JOptionPane
  - Simply pass in objects of your class into the solvers and solve for  $d$
  - Compute velocity, flow rate, etc.

# PS 8: Numerical Methods

- Optional GUI

