

ENGG1003 - Monday Week 8

Solving nonlinear algebraic equations

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Lecture overview

- 1 Solving nonlinear algebraic equations pp. 175-176
 - ▶ general setting
 - ▶ problem: fluid level in measuring cup
- 2 Bisection method §7.4
- 3 Secant method §7.3
 - ▶ Newton's method
- 4 Extensions
 - ▶ bisection & secant methods: re-write as functions
 - ▶ timing code in Python
 - ▶ speed comparisons: bisection vs. secant

1) Solving nonlinear algebraic equations

- *linear* equations: $ax + b = 0$
 - ▶ solution $x = -b/a$
- *nonlinear* equations
 - ▶ quadratic $ax^2 + bx + c = 0$: solution $x = \frac{-b \pm \sqrt{b^2 - 4ac}}{2a}$
 - ▶ cubic and quartic (orders 3 and 4): exact solutions exist but are *very* complicated
 - ▶ quintic (order 5) equations: exact solutions *do not exist* in general, proving that needs *serious* mathematics
- most equations in engineering applications have no exact “pen and paper” solutions!

Numerical solutions to equations

*“Far better an approximate answer to the right question. . .
than an exact answer to the wrong question”*
—John Tukey

General problem: find x satisfying

$$f(x) = 0$$

where $f(x)$ is a formula involving x

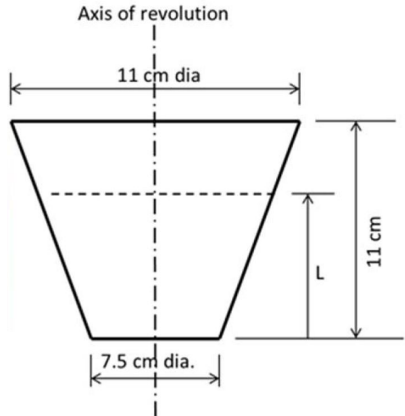
Example

$$f(x) = e^{-x} \sin(x) - \cos(x)$$

has solution $x = 7.85359326$ because

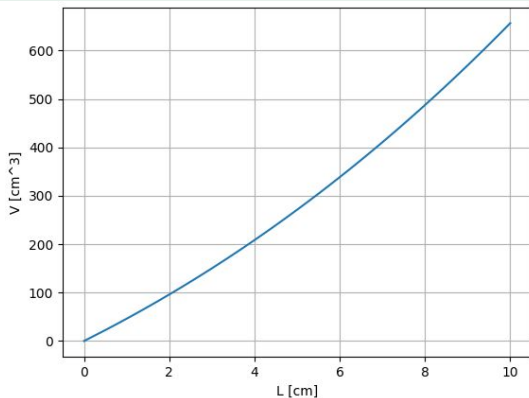
$$e^{-7.85359326} \sin(7.85359326) - \cos(7.85359326) = 0.000$$

Fluid level in truncated cone



- applications: water in dam, coal in conical hopper

Fluid level

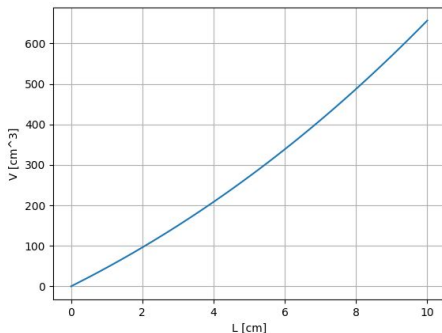


- volume V depends on depth L as follows:

$$V = 0.0268L^3 + 1.884L^2 + 44.15L$$

- ▶ V (in millilitres, mL), L (in cm)

Fluid level



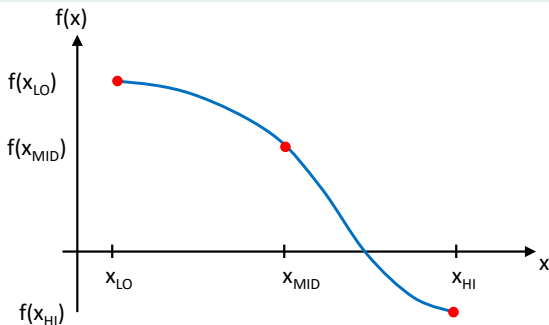
Q: depth L when cup holds 500 mL of water?

- need to solve equation

$$500 = 0.0268L^3 + 1.884L^2 + 44.15L$$

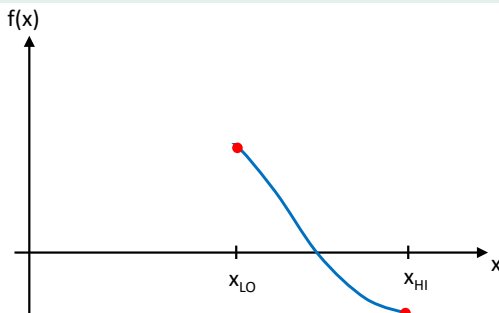
$$f(L) = 0.0268L^3 + 1.884L^2 + 44.15L - 500 = 0$$

2) Bisection method



- continuous function $f(x)$ on interval $[x_{LO}, x_{HI}]$, where value of f changes sign from x_{LO} to x_{HI}
- divide interval in two, $f(x) = 0$ in one sub-interval
- select sub-interval where sign of f changes & repeat

Bisection method



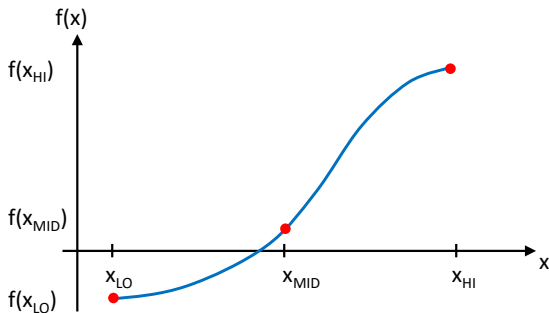
$$f(x_{MID}) \times f(x_{LO}) > 0$$

...select *upper sub-interval* by updating

$$x_{LO} = x_{MID}$$

...and repeat

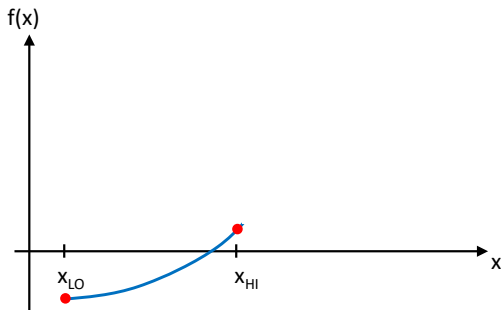
Bisection method



$$f(x_{MID}) \times f(x_{LO}) < 0$$

... select *lower sub-interval* by updating $x_{HI} = x_{MID}$

Bisection method



... and repeat, with new midpoint

$$x_{MID} = (x_{LO} + x_{HI})/2$$

- each iteration halves the width of interval $[x_{LO}, x_{HI}]$
- continue until $|f(x_{MID})| < \text{tolerance}$, eg: 10^{-6}

Bisection method: Python code

bisection.py

```
1 def f(L):
2     return 0.0268*L**3 + 1.884*L**2 + 44.15*L - 500
3
4 eps = 1e-6
5 x_LO = 6
6 x_HI = 10
7
8 x_MID = (x_LO + x_HI)/2
9 itCnt = 0
10 while abs(f(x_MID)) > eps:
11     if f(x_MID)*f(x_LO) > 0:
12         x_LO = x_MID
13     else:
14         x_HI = x_MID
15     x_MID = (x_LO + x_HI)/2
16     itCnt += 1
17
18 print('Solution: {}'.format(x_MID))
19 print('Number of iterations: {}'.format(itCnt))
20 print('Check: f({:.8f}) = {:.8f}'.format(x_MID, f(x_MID)))
```

Bisection method: simulation results

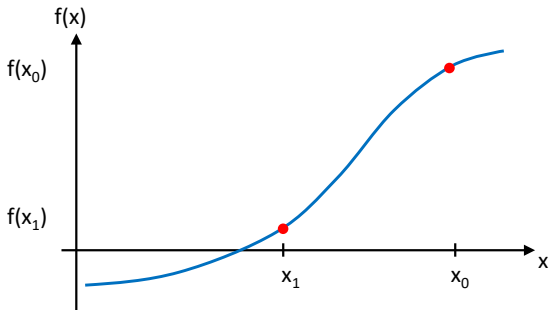
- lines 1–2: function f , want L such that $f(L) = 0$
- line 4: tolerance 10^{-6}
- lines 9 & 16: count loop iterations
- live demo

```
Solution: 8.15660098195076
```

```
Number of iterations: 26
```

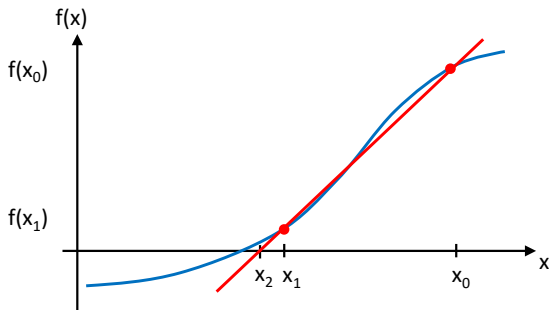
```
Check:  $f(8.15660098) = -0.00000099$ 
```

3) Secant method



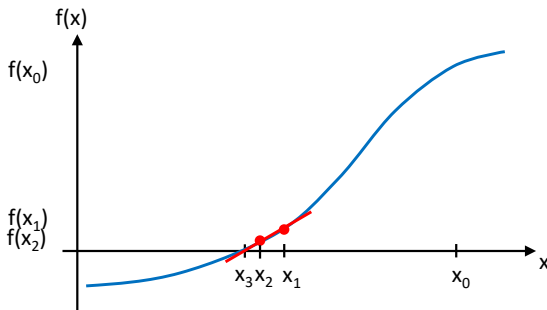
- start with two points $(x_0, f(x_0))$ and $(x_1, f(x_1))$
 - ▶ red dots
 - ▶ $f(x_0)$ and $f(x_1)$ do *not* necessarily have opposite signs

Secant method



- *secant* is line through $(x_0, f(x_0))$ and $(x_1, f(x_1))$
- define x_2 as point where secant intersects x -axis

Secant method



... and repeat, with x_3 defined as point where secant through $(x_1, f(x_1))$ and $(x_2, f(x_2))$ intersects x -axis

Secant method equations

Equation of secant connecting $(x_0, f(x_0))$ & $(x_1, f(x_1))$:

$$y = \frac{f(x_1) - f(x_0)}{x_1 - x_0} \cdot (x - x_1) + f(x_1)$$

Solving for intersection of secant with x -axis:

$$x_2 = x_1 - f(x_1) \cdot \frac{x_1 - x_0}{f(x_1) - f(x_0)}$$

Secant method equations

Equation of secant connecting $(x_0, f(x_0))$ & $(x_1, f(x_1))$:

$$y = \frac{f(x_1) - f(x_0)}{x_1 - x_0} \cdot (x - x_1) + f(x_1)$$

Solving for intersection of secant with x -axis:

$$x_2 = x_1 - f(x_1) \cdot \frac{x_1 - x_0}{f(x_1) - f(x_0)}$$

$$x_3 = x_2 - f(x_2) \cdot \frac{x_2 - x_1}{f(x_2) - f(x_1)}$$

$$x_4 = x_3 - f(x_3) \cdot \frac{x_3 - x_2}{f(x_3) - f(x_2)}$$

\vdots

Secant method: Python code

secant.py

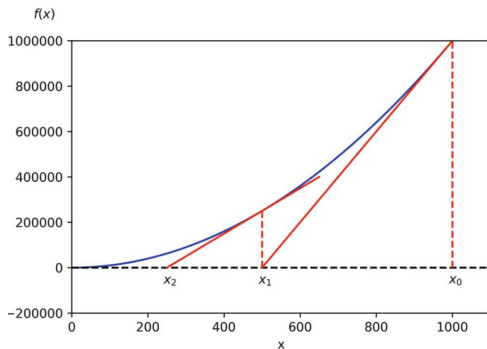
```
1 def f(L):
2     return 0.0268*L**3 + 1.884*L**2 + 44.15*L - 500
3
4 eps = 1e-6
5 x0 = 6
6 x1 = 10
7 itCnt = 0          # iteration counter
8 while abs(f(x1)) > eps:
9     # line (=secant) through (x0,f(x)) and (x1,f(x1)) intersects
10    # horizontal axis at (x,0)
11    x = x1 - f(x1)*((x1 - x0)/(f(x1) - f(x0)))
12    x0 = x1
13    x1 = x
14    itCnt += 1
15
16 print('Solution: {}'.format(x))
17 print('Number of iterations: {}'.format(itCnt))
18 print('Check: f({:.8f}) = {:.8f}'.format(x, f(x)))
```

Secant method: simulation results

- lines 12–13: this update simpler to code than $\{x_0, x_1\} \rightarrow x_2, \{x_1, x_2\} \rightarrow x_3, \{x_2, x_3\} \rightarrow x_4, \dots$
- live demo

```
Solution: 8.156600987863818  
Number of iterations: 4  
Check: f(8.15660099) = -0.00000052
```

Newton's method



- choose initial estimate x_0
- x_1 is intersection of *tangent line* through $(x_0, f(x_0))$
- x_2 is intersection of tangent line through $(x_1, f(x_1))$
- . . .

Newton's method

- also known as *Newton–Raphson method*
- Newton's method much more popular than bisection or secant methods
- calculation of “tangent lines” requires *derivative* of function $f(x)$
 - ▶ therefore needs *calculus* (eg: MATH1110)
 - ▶ beyond assumed knowledge for ENGG1003, won't consider Newton's method in this course
- secant method can be considered as an approximation to Newton's method

4) Extensions

bisection_fn.py

```
1 def f(L):
2     return 0.0268*L**3 + 1.884*L**2 + 44.15*L - 500
3
4 def my_bisection(f, x_LO, x_HI, tol):
5     x_MID = (x_LO + x_HI) / 2
6     itCnt = 0
7     while abs(f(x_MID)) > tol:
8         if f(x_MID) * f(x_LO) > 0:
9             x_LO = x_MID
10        else:
11            x_HI = x_MID
12            x_MID = (x_LO + x_HI) / 2
13            itCnt += 1
14    return x_MID, itCnt
15
16 x, numIt = my_bisection(f, 4, 12, 1e-6)
17
18 print('Solution: {}'.format(x))
19 print('Number of iterations: {}'.format(numIt))
20 print('Check: f({:.8f}) = {:.8f}'.format(x, f(x)))
```

Bisection method as a function

- line 4: `my_bisection` function takes function `f` as first argument
... also pass in x_{LO} , x_{HI} and convergence tolerance
- line 14: function returns approximate solution & iteration count
- line 16: call `my_bisection` function with four arguments
- live demo

Secant method as a function

secant_fn.py

```
1 def f(L):
2     return 0.0268*L**3 + 1.884*L**2 + 44.15*L - 500
3
4 def my_secant(f, x0, x1, tol):
5     itCnt = 0
6     while abs(f(x1)) > tol:
7         x = x1 - f(x1) * ((x1 - x0) / (f(x1) - f(x0)))
8         x0 = x1
9         x1 = x
10        itCnt += 1
11    return x1, itCnt
12
13 x, numIt = my_secant(f, 4, 12, 1e-8)
14
15 print('Solution: {}'.format(x))
16 print('Number of iterations: {}'.format(numIt))
17 print('Check: f({:.8f}) = {:.8f}'.format(x, f(x)))
```

- live demo

Timing code in Python

- often useful to measure time taken to perform calculations; easy in Python!
- start by importing `time` module:

```
1 import time
```

- function `time.perf_counter()` returns value of a clock
 - ▶ float value (in seconds)
- elapsed time is *difference* between two successive calls

```
1 tStart = time.perf_counter()
2 xB, numItB = my_bisection(f, 6, 10, 1e-6)
3 tStop = time.perf_counter()
4 tBisect = tStop - tStart
```

Speed comparison: bisection vs. secant

- live demo `bisectionvssecant.py`
- code in `#lecturecode`

```
Solution (bisection): 8.15660098195076  
Number of iterations (bisection): 26  
Check:  $f(8.15660098) = -0.00000099$   
Run-time (bisection): 6.166e-05 seconds
```

```
Solution (secant): 8.156600987863818  
Number of iterations (secant): 4  
Check:  $f(8.15660099) = -0.00000052$   
Run-time (secant): 1.257e-05 seconds
```

```
Secant method is 4.9 times as fast as bisection method
```

Lecture summary

- Solving nonlinear algebraic equations
- Bisection method
- Secant method
 - ▶ Newton's method
- Extensions

More information

- Newton's method in textbook §7.2
 - ▶ needs *differentiation* from calculus (MATH1110)
 - ▶ in particular: need expression for *tangent lines* to function $f(x)$, written as $f'(x)$
- “optimised” versions of bisection and secant methods in textbook §7.3 and §7.4
 - ▶ maximise speed of computation by minimising number of function evaluations $f(x)$
- volume of truncated cone based on volumes of solids of revolution (needs calculus, MATH1110)
<https://bit.ly/3sOsaj4>