# Numerical Errors

Part 2: Truncation Error and Total Numerical Error



## Outline (Part 1, Part 2)

- 1.1: Definitions
- 1.2: Roundoff Errors

- 2.1: Truncation Errors
- 2.2: Total Numerical Error



### 2.1: Truncation Errors



#### **Truncation Errors**

- Truncation Error: results from using an approximation in place of an exact mathematical procedure
- Example: Taylor Series

$$f(x) = \sum_{n=0}^{\infty} \frac{f^{(n)}(a)}{n!} (x - a)^n$$
 (3.6)

• *Example*: Finite-difference derivative approximation:

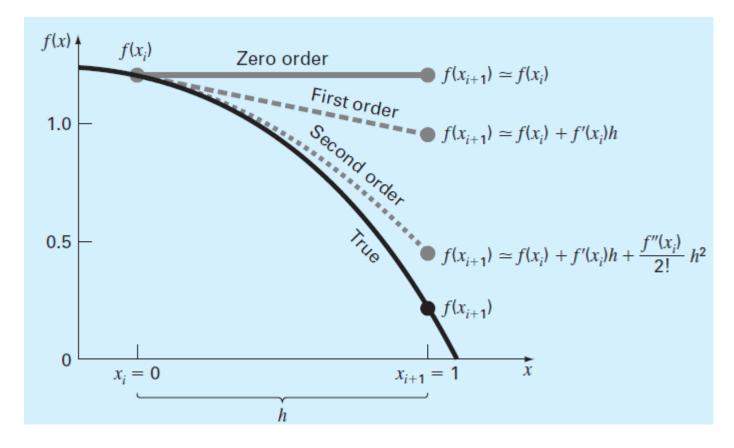
$$\frac{dy}{dx} \approx \frac{\Delta y}{\Delta x} = \frac{y_{i+1} - y_i}{x_{i+1} - x_i} \tag{3.7}$$



### Taylor Series

• Taylor Series allows us to approximate any smooth function as a

polynomial





### Taylor Series

 Big O notation: allows us to judge the comparative error of numerical methods based on Taylor Series expansions

| First Derivative                   |   |                     |
|------------------------------------|---|---------------------|
| Method                             | Formula   | Truncation<br>Error |
| Two-point forward dif-<br>ference  | $f'(x_i) = \frac{f(x_{i+1}) - f(x_i)}{h}$                                   | O(h)                |
| Three-point forward difference     | $f'(x_i) = \frac{-3f(x_i) + 4f(x_{i+1}) - f(x_{i+2})}{2h}$                  | $O(h^2)$            |
| Two-point backward difference      | $f'(x_i) = \frac{f(x_i) - f(x_{i-1})}{h}$                                   | O(h)                |
| Three-point backward difference    | $f'(x_i) = \frac{f(x_{i-2}) - 4f(x_{i-1}) + 3f(x_i)}{2h}$                   | $O(h^2)$            |
| Two-point central dif-<br>ference  | $f'(x_i) = \frac{f(x_{i+1}) - f(x_{i-1})}{2h}$                              | $O(h^2)$            |
| Four-point central dif-<br>ference | $f'(x_i) = \frac{f(x_{i-2}) - 8f(x_{i-1}) + 8f(x_{i+1}) - f(x_{i+2})}{12h}$ | $O(h^4)$            |

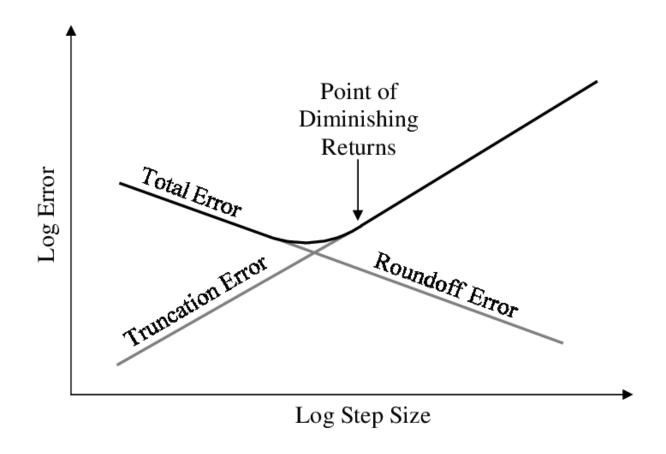
2.2: Total Numerical Error





#### Total Numerical Error

• Total Numerical Error = roundoff error + truncation error





#### Total Numerical Error

- Potential ways to reduce error:
  - Fully understand your mathematical model and the underlying assumptions
  - Leverage the Taylor Series to estimate the theoretical error
  - Avoid subtracting 2 nearly equal numbers (subtractive cancellation)
  - Operate on smaller numbers first
  - Have intermediate checks in your code to prevent large-scale error cascades
  - Perform sensitivity analyses
  - Obtain independent audits



### Summary

- Numerical Methods = approximating something → errors
- If you don't understand how errors affect your approximation, your work is meaningless!

- Roundoff errors: stems from computer's inability to represent numbers exactly
- Truncation errors: stems from using an approximation instead of the analytical procedure
- Tradeoff between roundoff/truncation errors