

# CS 450: Numerical Analysis<sup>1</sup>

## Introduction to Scientific Computing

University of Illinois at Urbana-Champaign

---

<sup>1</sup>*These slides have been drafted by Edgar Solomonik as lecture templates and supplementary material for the book “Scientific Computing: An Introductory Survey” by Michael T. Heath ([slides](#)).*

# Scientific Computing Applications

- ▶ **Mathematical modelling for computational science** *Typical scientific computing problems are numerical solutions to PDEs*
  - ▶ *Newtonian dynamics: simulating particle systems in time*
  - ▶ *Fluid and air flow models for engineering*
  - ▶ *PDE-constrained numerical optimization: finding optimal configurations (used in engineering of control systems)*
  - ▶ *Quantum chemistry (electronic structure calculations): many-electron Schrödinger equation*
- ▶ **Numerical algorithms: linear algebra and optimization**
  - ▶ *Linear algebra and numerical optimization are building blocks for machine learning and data science*
  - ▶ *Computer architecture, compilers, and parallel computing use numerical algorithms (matrix multiplication, Gaussian elimination) as benchmarks*



# Numerical Analysis

- ▶ **Numerical Problems involving Continuous Phenomena:**

- ▶ **Error Analysis:**

## Sources of Error

- ▶ **Representation of Numbers:**

- ▶ **Propagated Data Error:**

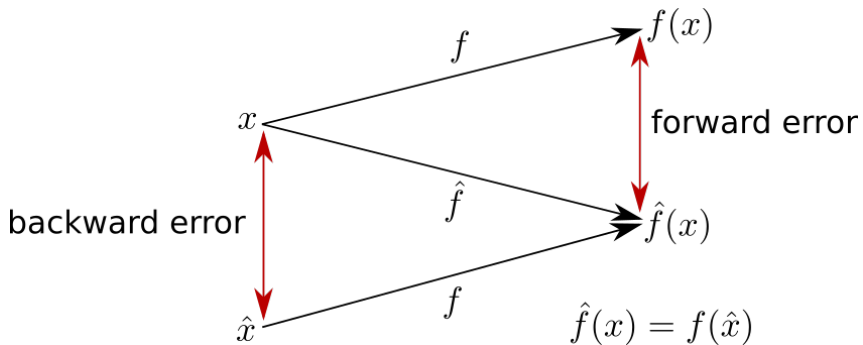
- ▶ **Computational Error =  $\hat{f}(x) - f(x)$  = Truncation Error + Rounding Error**

# Error Analysis

- ▶ **Forward Error:**

- ▶ **Backward Error:**

## Visualization of Forward and Backward Error



# Conditioning

▶ **Absolute Condition Number:**

▶ **(Relative) Condition Number:**



## Posedness and Conditioning

- ▶ **What is the condition number of an ill-posed problem?**

# Stability and Accuracy

▶ **Accuracy:**

▶ **Stability:**

## Error and Conditioning

- ▶ Two major sources of error: *roundoff* and *truncation* error.
  - ▶ roundoff error concerns floating point error due to finite precision
  - ▶ truncation error concerns error incurred due to algorithmic approximation, e.g. the representation of a function by a finite Taylor series
  
- ▶ To study the propagation of roundoff error in arithmetic we can use the notion of conditioning.

# Floating Point Numbers

*Demo: Picking apart a floating point number*

*Demo: Density of Floating Point Numbers*

- ▶ **Scientific Notation**

- ▶ **Significand (Mantissa) and Exponent** Given  $x$  with  $s$  leading bits  $x_0, \dots, x_{s-1}$

# Rounding Error

*Demo: Floating point and the Harmonic Series*

*Demo: Floating Point and the Series for the Exponential Function*

- ▶ **Maximum Relative Representation Error (Machine Epsilon)**

# Rounding Error in Operations (I)

*Demo: Catastrophic Cancellation*

*Activity: Cancellation in Standard Deviation Computation*

## ▶ Addition and Subtraction

## Rounding Error in Operations (II)

- ▶ **Multiplication and Division**





# Floating Point Number Line

