

# Numerical Analysis / Scientific Computing

CS 450/ECE 491 - Spring 2016

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# 1 Introduction to Scientific Computing

## What's the point of this class?

'Scientific Computing' describes a family of approaches to obtain approximate solutions to problems...

...once they've been stated mathematically.

○ Name some applications

- Simulation
- Data Analysis — Machine learning
- Image processing
- Signal processing

## What do we study, and how?

- Problems with real numbers (i.e. 'continuous' problems)  
*not discrete*
- What mathematical ideas do we use?  
*representation → compute with that*
- How good of an answer can we expect to our problem?  
*bound "error"*
- **How fast** can we expect the computation to complete?  
*complexity constant*
- How do these numerical methods **get implemented**?  
*tools → how do you use them?*

## Class web page

[bit.ly/cs450-s16](https://bit.ly/cs450-s16)

- Assignments
  - HW0!
  - Pre-lecture quizzes
  - In-lecture interactive content (bring computer or phone if possible)
- Textbook
- Exams
- Class outline (with links to notes/demos/activities/quizzes)
- Virtual Machine Image
- Piazza

- Policies
- Video

## Programming Language: Python/numpy

- Reasonably readable
- Reasonably beginner-friendly
- Mainstream (top 5 in 'TIOBE Index')
- Free, open-source
- Great tools and libraries (not just) for scientific computing
- Python 2/3? (3!)
- numpy: Provides an array datatype  
Will use this and matplotlib all the time.
- See class web page for learning materials

**Demo:** Sum the squares of the integers from 0 to 100.  
First without numpy, then with numpy.

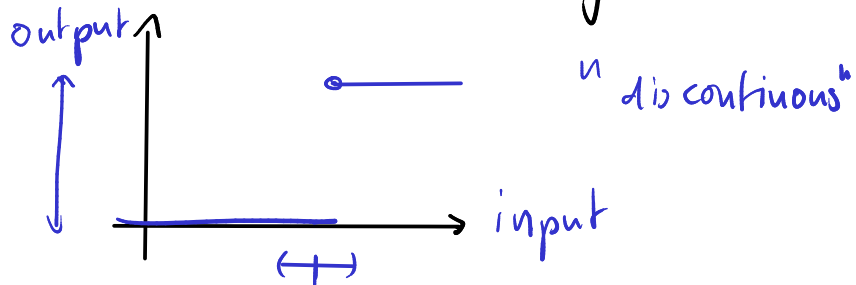
## 1.1 Errors, Conditioning, Accuracy, Stability



## What problems *can* we study in the first place?

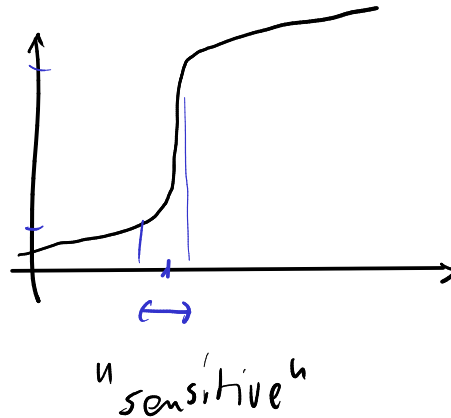
- To be able to compute a solution (through a process that introduces errors), the problem...

- needs to have a solution <sup>"well-posed"</sup>
- that solution should be unique
- the solution should depend continuously on the inputs



## Dependency on Inputs

- We excluded discontinuous problems—because we don't stand much chance for those.  
...what if the problem's input dependency is just **close to discontinuous**?



## Approximation

- When does approximation happen?

- input { measurement  
compute } before

- model

- truncation } during

- rounding

## Demo: Truncation vs. Rounding

## Example: Surface Area of the Earth

- Compute the surface area of the earth.  
What parts of your computation are approximate?

Earth is a sphere

$$A = 4\pi r^2$$

Look up radius of the earth

## Measuring Error

- How do we measure error?

**Idea:** Consider all error as being *added onto* the result.

→ Absolute error = approx value - true value

→ Relative error =  $\frac{\text{Absolute error}}{|\text{True value}|}$

"estimate" "bound"

## Recap: Norms

- What's a norm?

$$f: \mathbb{R}^n \longrightarrow \mathbb{R}_0^+$$

- Define norm.

For a vector  $x \in \mathbb{R}^n$ :

- $\|x\| > 0 \Leftrightarrow x \neq 0$
- $\|\gamma x\| = |\gamma| \|x\|$

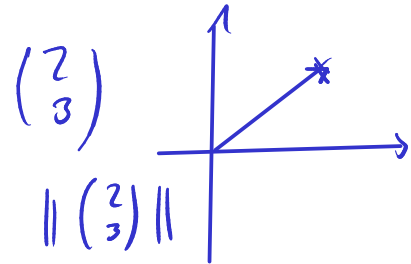
- Examples of norms?

$$\left\| \begin{pmatrix} x_1 \\ \vdots \\ x_n \end{pmatrix} \right\|_p = \sqrt[p]{|x_1|^p + \dots + |x_n|^p}$$

- Does the choice of norm really matter much?

$$\|\cdot\| \quad \|\cdot\|^*$$

$$\alpha \|x\| \leq \|x\|^* \leq \beta \|x\|$$



$$\|x\|$$

$\Delta$  ineq  
( $p \geq 1$ )

In finitely many dimensions, all norms are equivalent

## Demo: Vector norms