

## Computability & Complexity – Why it matters

- Church-Turing thesis
- Halting Problem
- Cardinality of infinite sets
  - Why is it relevant to computer science?
- Undecidable/unsolvable problems

1

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## Comments on last Projects

- Bio – Part II
  - We have posted the clusters of the Ito and Gavin data sets (mcl algorithm takes a long time to find them on Ito data)
  - Look at the solution we posted for Part 1

2

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## Turing Machine

- Has a tape of infinite length consisting of cells
  - Cells hold 0's or 1's
- At any time, the machine is in one of a finite number of states
- A read/write head accesses one cell of the tape
- One step consists of:
  - read the tape cell, write to it
  - change machine state
  - move head left, right or halt

3

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## von Neumann Architecture

- Refers to a computer architecture consisting of
  - a processing unit
  - a single separate storage structure to hold both instructions and data
- Implements a programmable Turing machine
- John von Neumann
  - Austro-Hungarian Mathematician
  - Member of the Manhattan Project

4

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Using Turing machines we can answer the following questions:

Are there problems that have no algorithm?

**Yes**

Are there functions that are not computable?

**Yes**

5

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## Church-Turing Thesis

- Church and Turing independently proposed models of computations
  - Church: lambda calculus
  - Turing: Turing machines
- Both capture the notion of computation
- Turing showed that these two very different models were equivalent
- Church was Turing's Ph.D. advisor at Princeton (1936-38)

6

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## Church-Turing Thesis

- Anything we naturally regard as computable is computable by a Turing machine.
- For any algorithm there exists an equivalent Turing machine.
- A Turing machine can do anything that can be described by a mechanical process.

*In order to study computation, we only need to study Turing machines.*

*If a process cannot be carried out by a Turing machine, then it cannot be computed.*

7

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## Are there problems for which there exists no algorithm?

YES, many.

They are called unsolvable/not computable problems.

### **Halting Problem (Zelle 13.4.2)**

The halting problem is the most famous of all unsolvable problems.

8

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## Write a program HALT to solve the following

### **Input for program HALT**

code of an arbitrary program P and an input I

### **Task**

determine whether program P halts on input I

### **Output of program HALT**

1 if P halts on input I

0 if P does not halt in input I

*Program HALT detects whether program P has an infinite loop.*

9

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## HALT solves the Halting Problem

**Claim:** Program HALT cannot exist

The Halting problem is not a computable problem.

We also say it is not a decidable problem.

If the Halting problem could be solved, it would solve a number of conjectures.

10

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## Goldbach's Conjecture

**Every even number greater than 2 is  
the sum of two primes.**

In 1742, Goldbach sent the conjecture to Euler who found it interesting, but could not prove it.

*If the Halting Problem can be solved, Goldbach's conjecture would be decided.*

Program P (has no input)

n = 2

while True:

    if 2\*n is not the sum of two prime numbers, then HALT

    n = n+1

11

## Which problem should you agree to write an algorithm for?

### Problem 1

Does there exist a positive integer-valued solution to

$$313(a^3 + b^3) = c^3$$

### Problem 2

Given a positive integer, reverse the digits and add it to the original number. Repeat until you get a palindrome.

$$5280 + 0825 = 6105$$

$$6105 + 5016 = 11121$$

$$11121 + 12111 = 23232$$

A. Problem 1

B. Problem 2

C. Neither

D. Both

12

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## Should be C)

**Problem 1:** Does there exist a positive integer-valued solution to  $313(a^3 + b^3) = c^3$  ?

*Answer: yes (has about 1000 digits)*

*(Fermat's Last Theorem:  $a^n + b^n = c^n$  has no solution for  $n > 2$ )*

**Problem 2:** Given a positive integer, reverse the digits and add it to the original number. Repeat until you get a palindrome.

*Answer: not known to terminate for 196 (first 9 million iterations do not)*

13

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## Which infinite set is not like the others?

- A.  $\mathbb{N} = \{0, 1, 2, 3, 4, 5, 6, 7, \dots\}$
- B.  $\mathbb{Z} = \{\dots, -3, -2, -1, 0, 1, 2, 3, 4, \dots\}$
- C.  $\mathbb{Q}$  = set of rational numbers
- D.  $\mathbb{R}$  = set of all real numbers**
- E.  $\mathbb{E} = \{0, 2, 4, 6, 8, 10, \dots\}$

14

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## Cardinality of infinite sets

Two sets A and B have the same *cardinality* if and only if there is a 1-1 correspondence from A to B.

- Consider sets E and N  
E is a proper subset of N.  
Yet, E and N have the same cardinality:  $f(x) = 2x$

0	1	2	3	4	5	6	7	8	9	10	...
0	2	4	6	8	10	12	14	16	18	20	

15

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## Infinite sets of the same cardinality

- Consider sets N and Z

$$f(x) = \begin{cases} x/2 & \text{if } x \text{ is even} \\ -(x+1)/2 & \text{if } x \text{ is odd} \end{cases}$$

0	1	2	3	4	5	6	7	8	9	10	...
0	-1	1	-2	2	-3	3	-4	4	-5	5	

16

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## Infinite sets of the same cardinality

Consider sets  $N$  and  $Q$  (positive integers and rational numbers)

- Surprisingly, there exists a 1-1 mapping
- Functions are harder/messier to express

17

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1/1	1/2	1/3	1/4	1/5	1/6	1/7	1/8	..
2/1	2/2	2/5	2/4	2/5	2/6	2/7	2/8	..
3/1	3/2	3/3	3/4	3/5	3/6	3/7	3/8	..
4/1	4/2	4/3	4/4	4/5	4/6	4/7	4/8	..
5/1	5/2	5/3	5/4	5/5	5/6	5/7	5/8	..
6/1	6/2	6/3	6/4	6/5	6/6	6/7	6/8	..
7/1	7/2	7/3	7/4	7/5	7/6	7/7		..
8/1	8/2	8/3	8/4	8/5	8/6			..
.	.							

Red numbers in the original image indicate the order of elements along the diagonals:

- Diagonal 1: 1/1 (1)
- Diagonal 2: 1/2 (2), 2/1 (3)
- Diagonal 3: 1/3 (4), 2/2 (5), 3/1 (6)
- Diagonal 4: 1/4 (7), 2/3 (8), 3/2 (9), 4/1 (10)
- Diagonal 5: 1/5 (11), 2/4 (12), 3/3 (13), 4/2 (14), 5/1 (15)
- Diagonal 6: 1/6 (16), 2/5 (17), 3/4 (18), 4/3 (19), 5/2 (20), 6/1 (21)
- Diagonal 7: 1/7 (22), 2/6 (23), 3/5 (24), 4/4 (25), 5/3 (26), 6/2 (27), 7/1 (28)
- Diagonal 8: 1/8 (29), 2/7 (30), 3/6 (31), 4/5 (32), 5/4 (33), 6/3 (34), 7/2 (35), 8/1 (36)

18

## Countable sets

A set is *countable* if

- It is finite, or
- It has the same cardinality as the natural numbers  $\mathbb{N}$

Countable sets:  $\mathbb{N}$ ,  $\mathbb{E}$ ,  $\mathbb{Z}$ ,  $\mathbb{Q}$

Uncountable set: real numbers  $\mathbb{R}$

19

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The real numbers between 0 and 1 are not countable

Assume they are countable. Then they can be listed as:

0.	d1,1	d1,2	d1,3	d1,4	d1,5	d1,6	d1,7	d1,8	...
0.	d2,1	d2,2	d2,3	d2,4	d2,5	d2,6	d2,7	d2,8	...
0.	d3,1	d3,2	d3,3	d3,4	d3,5	d3,6	d3,7	...	...
0.	d4,1	d4,2	d4,3	d4,4	d4,5	d4,6	d4,7	...	
0.	d5,1	d5,2	d5,3	d5,4	d5,5	...			
...									
...									

**Change the digits in the diagonal:**

**If it is a 4, set it to 5. Otherwise set it to 4.**

20

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0.	4	d1,2	d1,3	d1,4	d1,5	d1,6	d1,7	d1,8	...
0.	d2,1	5	d2,3	d2,4	d2,5	d2,6	d2,7	d2,8	...
0.	d3,1	d3,2	5	d3,4	d3,5	d3,6	d3,7		...
0.	d4,1	d4,2	d4,3	4	d4,5	d4,6	d4,7		
0.	d5,1	d5,2	d5,3	d5,4	4				
0.						4			
.							5		

Let  $r = 0.r_1r_2r_3r_4r_5 \dots$  be the number generated by the new diagonal values (0.4554445 ...)

**Real number  $r$  cannot be in this list! Why?**

21

*A digit on the diagonal cannot be 4 and 5 at the same time.*

## Putting it all together

- The assumed listing/enumeration of all real numbers between 0 and 1 cannot exist.
- **This means set  $\mathbf{R}$  is uncountable.**

The proof technique we used is called **diagonalization**.

- it negates/flips the values on the diagonal to obtain a contradiction

22

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Assume the Halting problem is decidable.

Then there exists a program HALT that given any program P and an input I decides whether P halts on I (returning a 1 means P halts, 0 means not halting)

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IN CLASS

Create a new program STRANGE which takes as an input any program P:

1. STRANGE calls HALT with P and P as inputs
2. **if** HALT(P,P) returns 0 (i.e., P on P does not halt)  
**then** STRANGE halts  
**else** STRANGE goes into an infinite loop

23

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What does STRANGE do on input STRANGE?

It calls HALT with STRANGE and STRANGE as inputs:

**if** HALT(STRANGE, STRANGE) returns 0 (i.e., STRANGE on input STRANGE does not halt)  
**then** STRANGE halts  
**else** STRANGE goes into an infinite loop

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But, STRANGE cannot halt and not halt at the same time!

Hence, program HALT cannot exist

24

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## Implications

- There exists no program solving the Halting problem
- There exists an infinite number of unsolvable problems
  - There exist more unsolvable problems than solvable ones
  - Fortunately, most problems we need to solve are solvable
- Being solvable does not mean not mean practically solvable
- Most optimization problems arising in applications take too much time to be solved exactly