

**ACMS Seminar, Fridays 3:30-4:30  
Smith 105**

- Algorithms Theme
- Today: 3:30-4:30 Smith 105
  - **Primes is in P!**
  - Hot-off-the-newswire talk by Neal Koblitz
    - new (this August) algorithm by Agrawal, Kayal, and Saxena
    - First deterministic polynomial-time algorithm for testing whether a number is prime!

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**Course Staff**

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**CSE 417: Algorithms and Computational Complexity**

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**Computability: Turing Machines & The Halting Problem**

Autumn 2002  
Paul Beame

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**Computing & Mathematics**

Computers as we know them grew out of a desire to avoid bugs in mathematical reasoning

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**A Brief History of Reasoning**

- Ancient Greece
  - Deductive logic
    - Euclid's Elements
  - Infinite things are a problem
    - Zeno's paradox



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**A Brief History of Reasoning**

- 1670's-1800's Calculus & infinite series
  - Suddenly infinite stuff really matters
  - Reasoning about infinite still a problem
    - Tendency for buggy or hazy proofs
- Mid-late 1800's
  - Formal mathematical logic
    - Boole [Boolean Algebra](#)
  - Theory of infinite sets
    - Cantor
    - "There are more real #'s than rational #'s"

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## A Brief History of Reasoning

- 1900
  - Hilbert's famous speech outlines goal: mechanize all of mathematics  
23 problems
- 1930's
  - Gödel, Turing show that Hilbert's program is impossible.  
Gödel's Incompleteness Theorem  
Undecidability of the Halting Problem

Both use ideas from Cantor's proof about reals & rationals

## A Brief History of Reasoning

- 1930's
  - How can we formalize what algorithms are possible?
    - Turing machines (Turing, Post)
      - basis of modern computers
    - Lambda Calculus (Church)
      - basis for functional programming
    - $\mu$ -recursive functions (Kleene)
      - alternative functional programming basis

All are equivalent!

## Turing Machines

**Church-Turing Thesis**  
Any reasonable model of computation that includes all possible algorithms is equivalent in power to a Turing machine

- Evidence
  - Huge numbers of equivalent models to TM's based on radically different ideas

## What is a Turing Machine?

- Formal definition
  - Turing & Post excerpts give descriptions
    - Turing's justification, based on intuition, that this is really the right notion.
  - Sipser handout gives full details
- Key properties
  - Manipulates finite sequences of symbols
  - Use a finite set of possible instructions
  - Each does only a finite amount of work per step
  - No *a priori* bound on resource usage
    - Can always get more resources if needed

## Turing Machine = Ideal C Program


- Ideal C/C++/Java programs
  - Just like the C/C++/Java you're used to programming with, except you never run out of memory
    - malloc** never fails
    - constructor methods always succeed
- Equivalent to Turing machines except a lot easier to program !
  - Exact TM definition doesn't matter to us so we'll just think of these programs as TM's.

## Turing machines as data

- Original Turing machine definition
  - A different machine **P** for each task
  - Each machine **P** is defined by a finite set of possible operations on finite set of symbols
    - P** has a finite description as a sequence of symbols, its code
- Notation:
  - We'll write **<P>** for the code of program **P** and **<P,x>** for the pair of the program code and an input **x**
  - i.e. **<P>** is the program text as a sequence of ASCII symbols and **P** is what actually executes

## A Universal Turing Machine

- A Turing machine interpreter **U**
  - On input  $\langle P \rangle$  and its input  $x$ , **U** outputs the same thing as **P** does on input  $x$
  - At each step it decodes which operation **P** would have performed and simulates it.
- One Turing machine is enough!
  - Basis for modern stored-program computer
    - Von Neuman studied Turing's UTM design



input  $x$  → **P** → output  $P(x)$        $x$  → **U** → output  $P(x)$   
 $\langle P \rangle$  → **U**

## Halting Problem

- Given:** the code of a program **P** and an input  $x$  for **P**, i.e. given  $\langle P, x \rangle$
- Output:** **1** if **P** halts on input  $x$   
**0** if **P** does not halt on input  $x$
- Theorem (Turing):** There is no program that solves the halting problem  
 "The halting problem is undecidable"

## Undecidability of the Halting Problem

- Suppose that there is a program **H** that computes the answer to the Halting Problem
- We'll build a table with
  - all the possible programs down one side
  - all the possible inputs along the other side
- Then we'll use the supposed program **H** to build a new program that can't possibly be in the table!

	input $x$											
	$\epsilon$	0	1	00	01	10	11	000	001	010	011	....
$\epsilon$	0	1	1	0	1	1	1	0	0	0	1	....
0	1	1	0	1	0	1	1	0	1	1	1	....
1	1	0	1	0	0	0	0	0	0	0	1	....
00	0	1	1	0	1	0	1	1	0	1	0	....
01	0	1	1	1	1	1	1	0	0	0	1	....
10	1	1	0	0	0	1	1	0	1	1	1	....
11	1	0	1	1	0	0	0	0	0	0	1	....
000	0	1	1	1	1	0	1	1	0	1	0	....
001	.	.	.	.	.	.	.	.	.	.	.	....
.	.	.	.	.	.	.	.	.	.	.	.	....
.	.	.	.	.	.	.	.	.	.	.	.	....

( $\langle P \rangle, x$ ) entry is **1** if program **P** halts on input  $x$  and **0** if it runs forever

## Diagonal construction

- Consider a row corresponding to some program code  $\langle P \rangle$ 
  - the infinite sequence of **0**'s and **1**'s in that row of the table is like a **fingerprint** of **P**
- Suppose a program for **H** exists
  - Then it could be used to figure out the value of any entry in the table
  - We'll use it to create a new program **D** that has a **different fingerprint** from every row in the table
  - But that's impossible since there is a row for every program ! **Contradiction**

	input $x$											
	$\epsilon$	0	1	00	01	10	11	000	001	010	011	....
$\epsilon$	0	1	1	0	1	1	1	0	0	0	1	....
0	1	1	0	1	0	1	1	0	1	1	1	....
1	1	0	1	0	0	0	0	0	0	0	1	....
00	0	1	1	0	1	0	1	1	0	1	0	....
01	0	1	1	1	1	1	1	0	0	0	1	....
10	1	1	0	0	0	1	1	0	1	1	1	....
11	1	0	1	1	0	0	0	0	0	0	1	....
000	0	1	1	1	1	0	1	1	0	1	0	....
001	.	.	.	.	.	.	.	.	.	.	.	....
.	.	.	.	.	.	.	.	.	.	.	.	....
.	.	.	.	.	.	.	.	.	.	.	.	....

( $\langle P \rangle, x$ ) entry is **1** if program **P** halts on input  $x$  and **0** if it runs forever

		input $x$												
		$\epsilon$	0	1	00	01	10	11	000	001	010	011	....	
program code $\langle P \rangle$	$\epsilon$	0	1	1	1	0	1	1	1	0	0	0	1	....
	0	1	1	0	1	0	1	1	0	1	1	1	....	
	1	1	0	1	0	0	0	0	0	0	0	1	....	
	00	0	1	1	0	1	0	1	1	0	1	0	....	
	01	0	1	1	1	1	1	1	0	0	0	1	....	
	10	1	1	0	0	1	0	1	1	1	1	....		
	11	1	0	1	1	0	0	0	0	0	0	1	....	
	000	0	1	1	1	1	0	1	1	0	1	0	....	
	001	...	...	...	...	...	...	...	...	...	...	...	....	
	.	...	...	...	...	...	...	...	...	...	...	...	....	

$\langle P \rangle, x$  entry is 1 if program  $P$  halts on input  $x$  and 0 if it runs forever

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		input Flipped diagonal											
		$\epsilon$	0	1	00	01	10	11	000	001	010	011	....
program code $\langle P \rangle$	$\epsilon$	1	1	1	0	1	1	1	0	0	0	1	....
	0	1	0	0	1	0	1	1	0	1	1	1	....
	1	1	0	0	0	0	0	0	0	0	0	1	....
	00	0	1	1	1	1	0	1	1	0	1	0	....
	01	0	1	1	1	0	1	1	0	0	0	1	....
	10	1	1	0	0	0	0	1	0	1	1	1	....
	11	1	0	1	1	0	0	1	0	0	0	1	....
	000	0	1	1	1	1	0	1	0	0	1	0	....
	001	...	...	...	...	...	...	...	...	...	...	...	....
	.	...	...	...	...	...	...	...	...	...	...	...	....

Want to create a new program whose halting properties are given by the flipped diagonal

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### Code for $D$ given subroutine for $H$

- Function  $D(x)$ :
  - if  $H(x,x)=1$  then
    - while (true); /\* loop forever \*/
  - else
    - no-op; /\* do nothing and halt \*/
  - endif
- $D$ 's fingerprint is different from every row of the table

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### That's it!

- We proved that there is no computer program that can solve the Halting Problem.
- This tells us that there is no compiler that can check our programs and guarantee to find any infinite loops they might have
  - The full story is even worse

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### Using the undecidability of the halting problem

- We have one problem that we know is impossible to solve
  - Halting problem
- Showing this took serious effort
- We'd like to use this fact to derive that other problems are impossible to solve
  - don't want to go back to square one to do it

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### Another undecidable problem

- The "always halts" problem
  - Given:  $\langle M \rangle$ , the code of a program  $M$
  - Output: 1 if  $M$  halts on every input  
0 if not.
- Claim: the "always halts" problem is undecidable
- Proof idea:
  - Show we could solve the Halting Problem if we had a solution for the "always halts" problem.
  - No program solving for Halting Problem exists
  - $P$  no program solving the "always halts" problem exists

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### What we would like

- To solve the Halting Problem need to handle inputs of the form  $\langle P, x \rangle$
- Our program will create a new program code  $\langle M \rangle$  so that
  - If  $P$  halts on input  $x$ 
    - then  $M$  **always** halts
  - If  $P$  runs forever on input  $x$ 
    - then  $M$  runs forever on at least one input
- In fact, the  $\langle M \rangle$  we create will act the same on all inputs

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### Creating $\langle M \rangle$ from $\langle P, x \rangle$

- Given  $\langle P, x \rangle$  modify code of  $P$  to:
  - Replace all input statements of  $P$  that read input  $x$ , by assignment statements that 'hard-code'  $x$  in  $P$
- This creates a new program text  $\langle M \rangle$
- It would be easy to write a program  $T$  that changes  $\langle P, x \rangle$  to  $\langle M \rangle$

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### The transformation

<pre>int main(){   ...   scanf("%d",&amp;u);   ...   scanf("%d",&amp;v);   ... }</pre> <p style="text-align: center;"><math>\langle P, x \rangle</math></p>	<pre>int main(){   ...   u = 123;   ...   v = 712;   ... }</pre> <p style="text-align: center;"><math>\langle M \rangle</math></p>
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### Program to solve Halting Problem if "always halts" were decidable

- Suppose "always halts" were solvable by program  $A$
- On input  $\langle P, x \rangle$ 
  - execute the program  $T$  to transform  $\langle P, x \rangle$  into  $\langle M \rangle$  as on last slide
  - call  $A$  with  $\langle M \rangle$  (the output of  $T$ ) as its input and use  $A$ 's output as the answer.

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### Another undecidable problem

- The "yes" problem**
  - Given:**  $\langle M \rangle$ , the code of a program  $M$
  - Output:** 1 if  $M$  outputs "yes" on every input  
0 if not.
- Claim:** the "yes" problem is undecidable
- Proof idea:**
  - Show we could solve the Halting Problem if we had a solution for the "yes" problem.
  - No program solving for Halting Problem exists
    - $\Rightarrow$  no program solving the "yes" problem exists

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### What we would like

- To solve the Halting Problem need to be able to handle inputs of the form  $\langle P, x \rangle$
- We'll create a new program code  $\langle M \rangle$  so that
  - If  $P$  halts on input  $x$ 
    - then  $M$  **always** outputs "yes"
  - If  $P$  runs forever on input  $x$ 
    - then  $M$  does something else on at least one input.

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### Creating $\langle M \rangle$ from $\langle P, x \rangle$

- Given  $\langle P, x \rangle$  modify code of  $P$  to:
  - Remove all output statements from  $P$
  - Replace all input statements of  $P$  that read input  $x$ , by assignment statements that hard-code  $x$  in  $P$
  - Add a new last statement that prints "yes"
- This creates a new program text  $\langle M \rangle$
- It would be easy to write a program  $T$  that changes  $\langle P, x \rangle$  to  $\langle M \rangle$

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### Program to solve Halting Problem if the "yes" problem were decidable

- Suppose the "yes" problem were solvable by program  $Y$
- On input  $\langle P, x \rangle$ 
  - execute the code to transform  $\langle P, x \rangle$  into  $\langle M \rangle$  as on last slide
  - call  $Y$  with  $\langle M \rangle$  (the output of  $T$ ) as its input and use  $Y$ 's output as the answer.

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### Equivalent program problem

- Given:** the codes of two programs,  $\langle P \rangle$  and  $\langle Q \rangle$
- Output:** 1 if  $P$  produces the same output as  $Q$  does on every input  
0 otherwise

**Exercise:** Show that the equivalent program problem is undecidable.

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### A general phenomenon: Can't tell a book by its cover

- Suppose you have a problem  $C$  that asks, given program code  $\langle P \rangle$ , to determine some property of the input-output behavior of  $P$ , answering 1 if  $P$  has the property and 0 if  $P$  doesn't have the property.
- Rice's Theorem:** If  $C$ 's answer isn't always the same then there is no program deciding  $C$

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### Even harder problems

- Recall that with the halting problem, we could always get at least one of the two answers correct
  - if it halted we could always answer 1 (and this would cover precisely all 1's we need to do) but we can't be sure about answering 0
- There are natural problems where you can't even do that!
  - The equivalent program problem is an example of this kind of even harder problem.

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### Quick lessons

- Don't rely on the idea of improved compilers and programming languages to eliminate major programming errors
  - truly safe languages can't possibly do general computation
- Document your code!!!!
  - there is no way you can expect someone else to figure out what your program does with just your code ....since....in general it is provably impossible to do this!

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