

# CS 121: Lecture 15

## More Uncomputability

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Book: <https://introtcs.org>

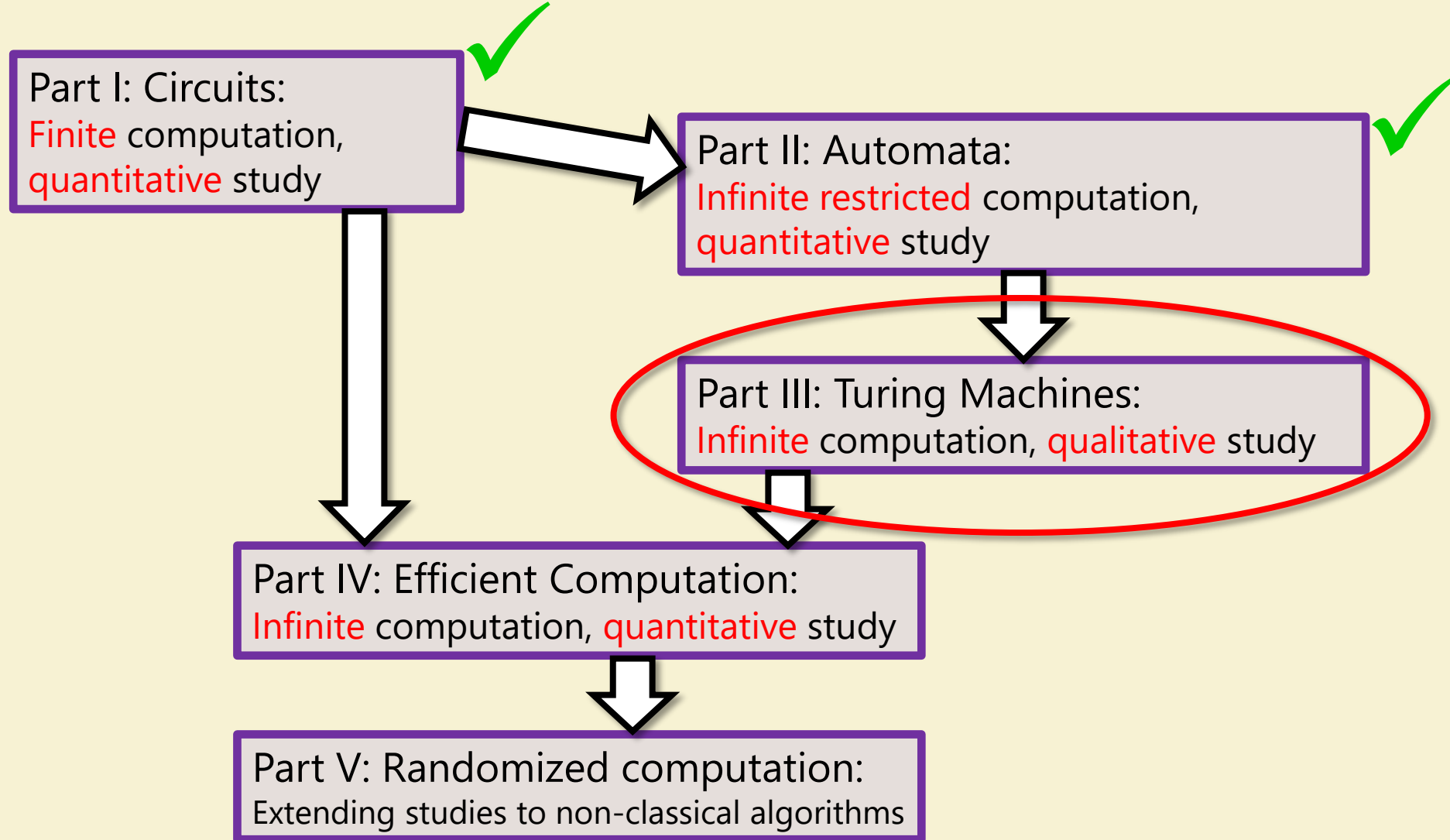
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# Announcements:

- Advanced Section: Nada Amin: Uncomputability & PL Design
- Thanks for feedback.
  - Confirm – are breakouts no good?
  - TFs scouring the feedback also!
- Sections: Week 7 cycle start, material on canvas (as usual).



# Where we are:



# Review of last lecture

- # of functions = uncountable =  $|\mathbb{R}|$
- # of computable functions = countable. =  $|\mathbb{N}|$
- So ...  $\exists$  an uncomputable function
- Further Cantor( $M$ ) =  $\overline{M(M)}$  uncomputable

$$f: \{0,1\}^* \rightarrow \{0,1\}$$

# This lecture (& next)

- Uncomputability much more pervasive
- “Intent of a program” uncomputable

# Today: HALT is uncomputable

- Definition:  $\text{HALT}(M,x) = 1$  if  $M$  halts on input  $x$ ; 0 otherwise.

$$\text{HALT} : \begin{matrix} \{0,1\}^* & \times & \{0,1\}^* & \rightarrow & \{0,1\} \\ \uparrow & & \uparrow & & \\ M & & x & & \end{matrix}$$

- 2 Proofs:

- Diagonalization
- Reduction from CANTOR

$$\exists \quad \uparrow^{-1}$$

$$E : \{0,1\}^* \times \{0,1\}^* \times \{0,1\}^* \rightarrow \{0,1\}^*$$

use "prefix-free encodings"

# Proof 1 (Direct Diagonalization):

- Let  $A$  be a TM that solves HALT, i.e.,  $\forall M, x, A(M, x) = \text{HALT}(M, x)$
- Consider the following Algorithm (which has equivalent TM – HOC AEIT)

$B(z)$ :  
Compute  $A(z, z)$   
If  $A(z, z) = 1$  then loop forever  
Else Halt and output 1.

- Note: We are defining  $B$  but not running it! It does not have to halt (in fact crucial that it does not on some inputs).
- Key point:  $B$  is a TM.

# Proof 1 (Direct Diagonalization):

- Let  $A$  be a TM that solves HALT, i.e.,  $\forall M, x, A(M, x) = \text{HALT}(M, x)$

- Consider  $B$

$B(z)$ :  
Compute  $A(z, z)$   
If  $A(z, z) = 1$  then loop forever  
Else halt and output 1.

- What is  $A(B, B)$ ?

- Case 1:  $A(B, B) = 1 \Rightarrow$  (by correctness of  $A$ )  $B$  halts on input  $B$   
 $\Rightarrow$  (by construction of  $B$ )  $B$  loops forever  $\Rightarrow$  Contradiction.

$B(B) ?$

$B(B) \curvearrowright$



# Proof 1 (Direct Diagonalization):

- Let  $A$  be a TM that solves HALT, i.e.,  $\forall M, x, A(M, x) = \text{HALT}(M, x)$

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- What is  $A(B, B)$ ?

- Case 1:  $A(B, B) = 1 \Rightarrow$  (by correctness of  $A$ )  $B$  halts on input  $B$   
 $\Rightarrow$  (by construction of  $B$ )  $B$  loops forever  $\Rightarrow$  Contradiction.
- Case 2:  $A(B, B) = 0 \Rightarrow$  (by correctness of  $A$ )  $B$  does not halt on input  $B$   
 $\Rightarrow$  (by construction of  $B$ )  $B$  halts on  $B$  (outputs 1)  $\Rightarrow$  Contradiction!

# Thoughts:

- Very slick!
- But just an implementation of Diagonalization. (Note  $B(B)$ ;  $A(z, z)$  ...)
- Food for thought: What happens if  $A$  does not always halt but correctly determines  $\text{HALT}(M, x)$  on inputs where it halts?

## Gödel's Incompleteness

Either PL is not capable of executing every computable function or, it can not be checked for HALT.

# Proof 2: (General) Reduction

"clearly only way to compute  $G$  is by

- Reductions: Key theme in Computer Science

- Function  $F$  reduces to  $G$  ( $F \leq G$ ) if algorithm for  $G$  implies algorithm for  $F$
- How to prove it?

Computing  
 $F$ "

```
Alg- $F(x)$ :  
Blah Blah Blah  
 $z = \text{Alg-}G(y)$   
Blah blah blah
```

- Build algorithm for  $F$  using Alg- $G$  as subroutine.
- Alg- $F$  correctly computes  $F$  if Alg- $G$  correctly computes  $G$

↑  
DO NOT  
USE

- Usual Interpretation: Positive:

- Somebody builds tools for mean, median; I just invoke it on my data with wrapper.

- Our Use: Negative:

- Start with  $F$  known not to have algorithm. Infer  $G$  does not!
  - Do you remember any so far in this course?

# Example: HALT uncomputable

- Recall CANTOR uncomputable.
- Will use this to prove HALT uncomputable.
- So what do we need to do?

$G = \text{HALT}$   
 $F = \text{CANTOR}$

Alg- $F(x)$ :  
Blah Blah Blah  
 $z = \text{Alg-}G(y)$   
Blah blah blah

HALT is uncomput

CANTOR is computable  $\Leftrightarrow$  HALT is computable

CANTOR is uncomputable

# Example: **HALT** uncomputable

- Recall CANTOR uncomputable.
- Will use this to prove HALT uncomputable.
- So what do we need to do?

```
Alg-CANTOR( $x$ ):  
Blah Blah Blah  
   $z = \text{Alg-HALT}(y)$   
Blah blah blah
```

# ALG-CANTOR

- Recall  $\text{CANTOR}(M) = \overline{M(M)}$

Alg-CANTOR( $M$ ):

$b \leftarrow \text{Alg-HALT}(M, M)$

If  $b = 0$  output 1

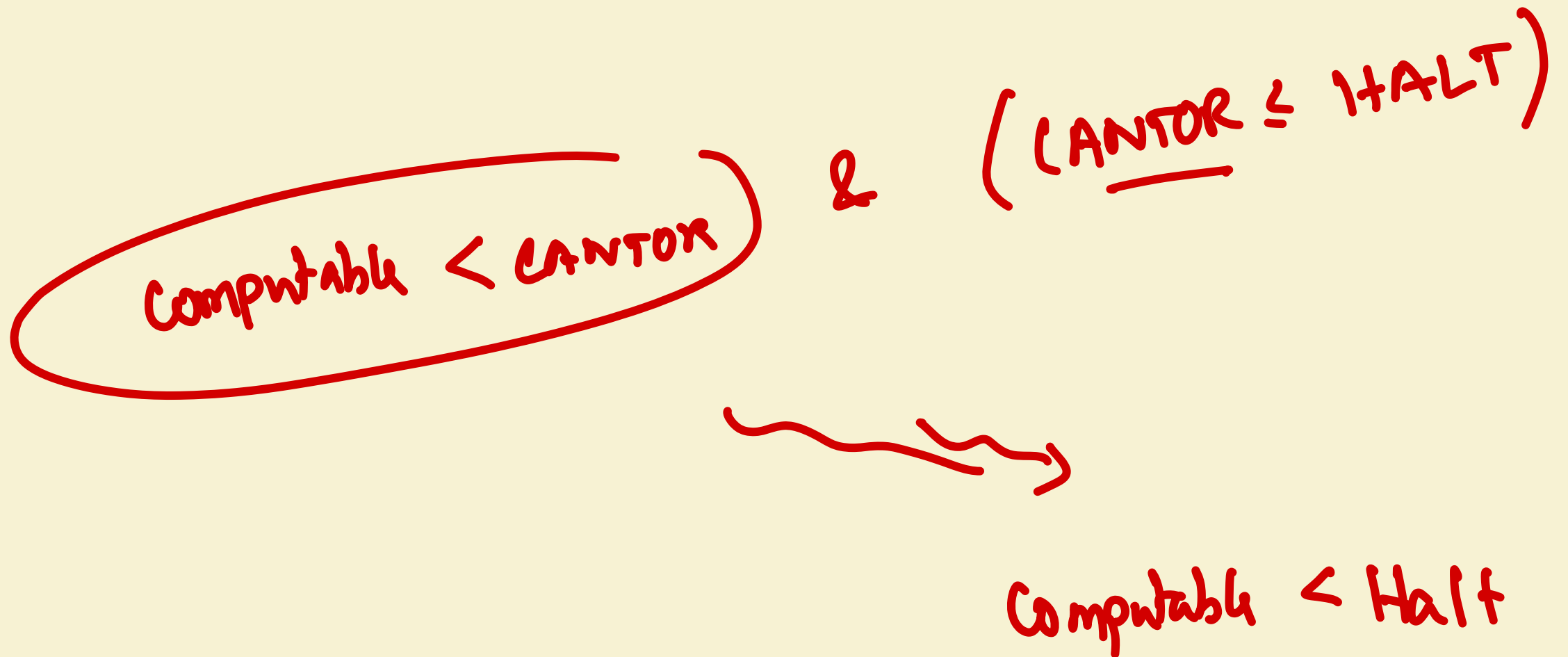
Else run  $M$  on  $M$  and let output be  $c$

Output  $\bar{c}$

- Claim 1: Alg-CANTOR always halts if Alg-HALT correct.
- Claim 2: Alg-CANTOR correctly computes CANTOR.
- Claim 1 + Claim 2: Alg-CANTOR computes (the uncomputable function) CANTOR if Alg-HALT exists  $\Rightarrow$  Alg-HALT does not exist  $\Leftrightarrow$  HALT uncomputable.

# What did we prove?

- CANTOR  $\leq$  HALT ? Or HALT  $\leq$  CANTOR?



# (Basic) Reduction

- For many problems we will use a very basic reduction (even simpler than  $\text{CANTOR} \leq \text{HALT}$ )

```
Alg-F( $x$ ):  
   $y = R(x)$   
  Return Alg-G( $y$ )
```



# Example:

- $E(M) = 1 \Leftrightarrow \forall x, M(x) = 0$  or  $M$  does not halt on  $x$   
 $\exists z, M(z) = 1$
- $\text{HALT} \leq E$

Alg-HALT( $M, x$ ):

Define  $M_x$  as follows:

$M_x(z)$ : Ignore  $z$ ,  
output 1 if  $M$  halts on  $x$   
output 0 o.w.

Return Alg-E( $M_x$ )

# Section + Next Lecture

- More Uncomputability + Reductions
  - HALT-ON-ZERO
    - $H-O-Z(M) = 1$  if  $M$  accepts "" and 0 otherwise.
    - Moral: It is not the infinity of inputs that makes HALT hard!
  - Rice's theorem
    - Every non-trivial semantic property of algorithms is uncomputable!