

## UNIT 14C

### The Limits of Computing: Uncomputable Functions

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## Problem Classifications

- **Tractable Problems**
  - Problems that have reasonable, polynomial-time solutions
- **Intractable Problems**
  - Problems that may have no reasonable, polynomial-time solutions
- **Uncomputable Problems**
  - Problems that have no algorithms at all to solve them

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## RECALL FROM LAST LECTURE

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## Decidability vs. Verifiability

P = the class of problems that can be **decided (solved)**  
**quickly**

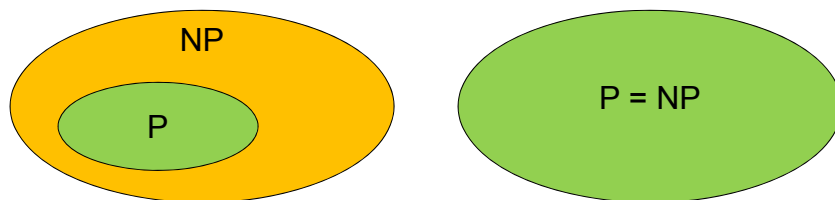
NP = the class of problems for which candidate  
solutions can be **verified quickly**

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## Two Possibilities

We do not know which of these possibilities is true.



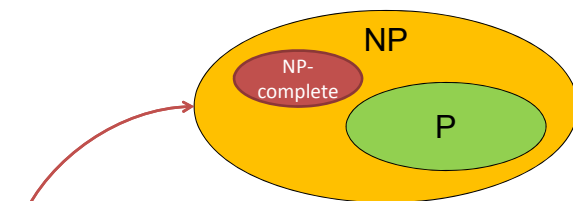
If  $P \neq NP$ , then some decision problems can't be solved in polynomial time.

If  $P = NP$ , then all computable problems can be solved in polynomial time.

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## Why is NP-completeness of Interest?



Theorem: If any NP-complete problem is in P then all are and  $P = NP$ .

Most believe  $P \neq NP$ . So, in practice NP-completeness of a problem prevents wasting time from trying to find a polynomial time solution for it.

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## Today's Lecture

- We will look **the Halting Problem** that is a canonical problem in the study of limits of computing.
- We will show using **proof by contradiction** that it cannot be solved.
- Along the way, we will think about **termination** and programs that have some form of **self-reference**.

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## The Barber Paradox

- Suppose there is a town with just one barber, who is male. In this town, every man keeps himself clean-shaven, and he does so by doing **exactly one of two things**:
  1. Shaving himself, or
  2. Going to the barber.
- Another way to state this is: The barber is a man in town who shaves those and only those men in town who do not shave themselves.
- Who shaves the barber?

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## Program Termination

- Can we determine if a program will terminate given a valid input?

- Example:

```
def mystery1(x)
  while (x != 1) do
    x = x - 2
  end
end
```

- Does this algorithm terminate when  $x = 15$ ?
- Does this algorithm terminate when  $x = 110$ ?

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## Another Example

```
def mystery2(x)
  while (x != 1) do
    if x % 2 == 0 then
      x = x / 2
    else
      x = 3 * x + 1
    end
  end
end
```

- Does this algorithm terminate when  $x = 15$ ?
- Does this algorithm terminate when  $x = 110$ ?
- Does this algorithm terminate for any positive  $x$ ?

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## The Halting Problem

- Does a universal program  $H$  exist that can take any program  $P$  and any input  $I$  for program  $P$  and determine if  $P$  terminates/halts when run with input  $I$ ?
- Alan Turing showed that such a universal program  $H$  cannot exist.
  - This is known as **the Halting Problem**.

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## Proof by Contradiction (example)

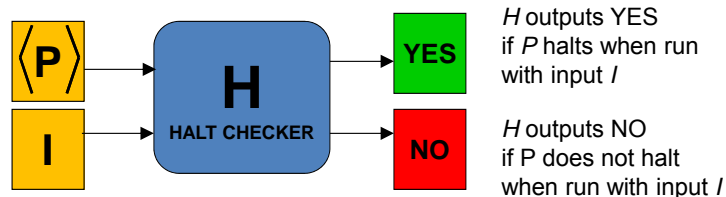
Suppose you want to prove the proposition “One cannot get an A in this course without doing the homeworks”.

1. You first assume the opposite: “One can get an A in this course without doing the homeworks”.
2. From that assumption and using what you know about the course you arrive at a conclusion, which is not true (e.g. Homeworks are worth less than 10%).
3. Since you know that this conclusion is false (contradicts with what is known), the initial assumption must be wrong.  
 “One can get an A in this course without doing the homeworks”. ← Must be false

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## Proof by Contradiction (first step)

- Assume a program  $H$  exists that requires a program  $P$  and an input  $I$ .
  - $H$  determines if program  $P$  will halt when  $P$  is executed using input  $I$ .



- We will show that  $H$  cannot exist by showing that if it did exist we would get a logical contradiction.

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## Programs Computing with Their Own Representation

- A compiler is a program that takes as its input a program that needs to be translated from a high-level language (e.g. Ruby) to a low-level language (e.g. machine language).
  - In general, a program can process any data, so it can have a program as its input to process.
- Can a compiler compile itself? **YES!**

## Proof (cont'd)

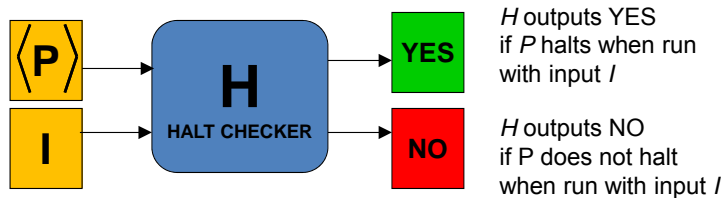
- Let  $D$  be a program that takes input  $\langle M \rangle$  where  $\langle M \rangle$  is a program description.
- $D$  asks the halt checker  $H$  what happens if  $M$  runs with itself  $\langle M \rangle$  as input?
- If  $H$  answers that  $M$  will halt if it runs with itself as input, then  $D$  goes into an infinite loop (and does not halt).
- If  $H$  answers that  $M$  will not halt if it runs with itself as input, then  $D$  halts.

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## Recall the Halt Checker

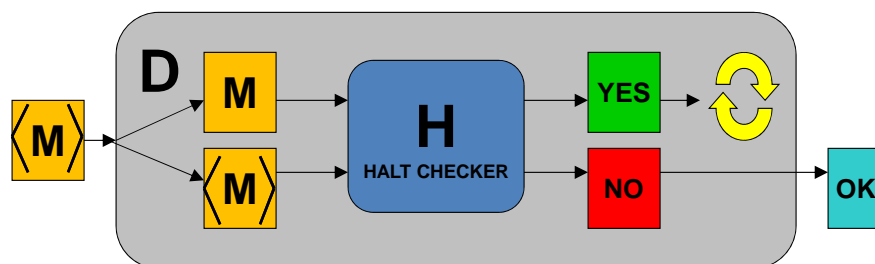
- Assume a program  $H$  exists that requires a program  $P$  and an input  $I$ .
  - $H$  determines if program  $P$  will halt when  $P$  is executed using input  $I$ .



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## How to Construct D



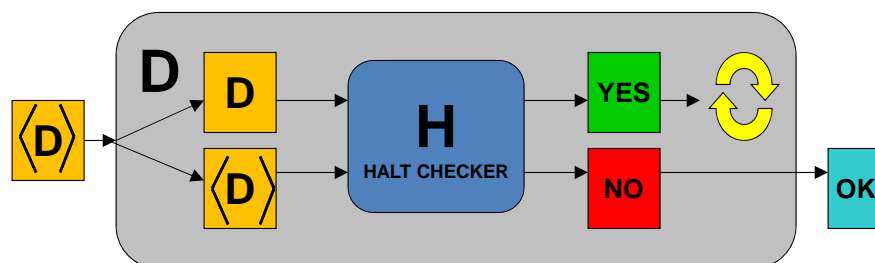
*D* asks *H* what happens if we run program *M* on with input  $\langle M \rangle$ .  
 Loops if it says yes.  
 Stops and returns OK if it says no.

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## D gets evil

- What happens if *D* tests itself?
  - If *H* answers yes (*D* halts), then *D* goes into an infinite loop and does not halt.



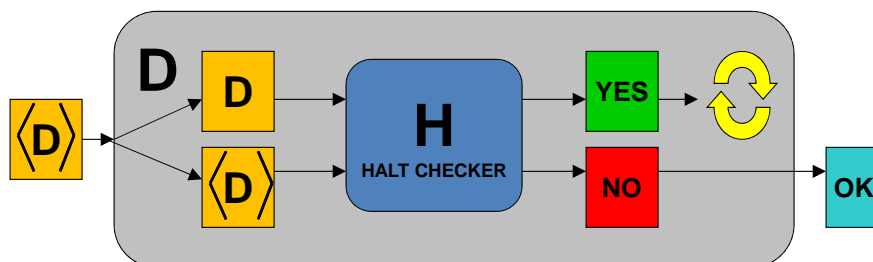
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## Proof By Contradiction (last step)

- What happens if  $D$  tests itself?
  - If  $D$  does not halt on  $\langle D \rangle$ , then  $D$  halts on  $\langle D \rangle$ .
  - If  $D$  halts on  $\langle D \rangle$ , then  $D$  does not halt on  $\langle D \rangle$ .

contradiction



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## Contradiction

- No matter what  $H$  answers about  $D$ ,  $D$  does the opposite, so  $H$  can never answer the halting problem for the specific program  $D$ .
  - Therefore, a universal halting checker  $H$  cannot exist.
- We can never write a computer program that determines if ANY program halts with ANY input.
  - It doesn't matter how powerful the computer is.
  - It doesn't matter how much time we devote to the computation.

## Why Is Halting Problem Special?

- One of the first problems to be shown to be noncomputable (i.e. undecidable, unsolvable)
- A problem can be shown to be uncomputable by reducing the halting problem into that problem

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## Do We Give up on Uncomputable Problems

- Uncomputable (undecidable, unsolvable) means there is no procedure (algorithm) that
  1. Always terminates
  2. Always give the correct answer

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## Living with Uncomputable Functions

- We should give up either one of these conditions
  - We usually prefer to give up 2 (correctness in all cases)
  - For example, a virus detection software cannot detect if a program is a virus for all possible programs. To be computable, they need to give up correctness for some cases.

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## What Should You Know?

- The fact that there are limits to what we can compute at all and what we can compute efficiently.
  - What do we mean when we call a problem tractable/intractable?
  - What do we mean when we call a problem solveable (i.e. computable, decidable) vs. unsolveable (noncomputable, undecidable)?
- What the question P vs. NP is about.
- Name some NP-complete problems and reason about the work needed to solve them using brute-force algorithms.
- The fact that Halting Problem is unsolveable and that there are many others that are unsolveable.

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