

# 01204211 Discrete Mathematics

## Lecture 12b: Undecidability (2)

Jittat Fakcharoenphol

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# Decision problems

- ▶ Given an integer  $x$ , is  $x$  odd?
- ▶ Given a string  $w$ , is  $w$  palindrome?
- ▶ Given a string  $w$ , is  $w \in \{0^n 1^n \mid n \geq 0\}$ ?
- ▶ Given a map, a starting position  $s$ , a destination  $t$ , and an integer  $k$ , does there exist a path from  $s$  to  $t$  with distance at most  $k$ ?
- ▶ Given a program  $P$  and input string  $w$ , when running  $P$  with  $w$  as an input, does  $P$  terminate?

# Decision problems and languages

For this problem:

Given an integer  $x$ , is  $x$  odd?

we can define a corresponding language

$$L_E = \{\dots, -6, -4, -2, 0, 2, 4, 6, \dots\}.$$

To solve this problem, given  $x$ , we can ask if  $x \in L_E$ .

# Deciders

We say that a python program  $P$  **decides** the language  $L$  if for any input string  $x$ ,  $P$  when running with  $x$  as an input,

- ▶  $P$  always terminates,
- ▶  $P$  outputs **yes**, if  $x \in L$ , and
- ▶  $P$  outputs **no**, if  $x \notin L$ .

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If we believe that anything that a computer can do can be written as a python program, and there is no python program that decides a language  $A$ , then we say that

$A$  is undecidable.

# Language HALTA and HALT

Let  $\mathbb{P}$  be the set of all python programs. Let the language HALTA be

$$\{P \in \mathbb{P} \mid \text{when running } P \text{ with } P \text{ as an input, } P \text{ terminates}\}$$

Or with a more concise notation:

$$\text{HALTA} = \{P \in \mathbb{P} \mid P(P) \text{ terminates}\}.$$

We also have another related language

$$\text{HALT} = \{(P, w) \mid P \text{ is a python program such that } P(w) \text{ terminates}\}$$

## Lemma 1

$\text{HALT}_A$  *and*  $\text{HALT}$  *are undecidable.*

## Reduction: proving undecidability of $\text{HALT}$

- ▶ We show that if  $\text{HALT}$  is decidable, then  $\text{HALT}_A$  is also decidable.
- ▶ However,  $\text{HALT}_A$  IS UNDECIDABLE.
- ▶ We conclude that  $\text{HALT}$  is also undecidable.



# Reduction in picture

Let  $\text{ACCEPT} = \{(P, w) \mid P \in \mathbb{P} \text{ and } P(w) \text{ terminates with acceptance}\}$ .

## Lemma 2

*ACCEPT is undecidable.*

## Proof.

We prove the lemma by contradiction. Assume that there is a python program  $Q$  that decides  $\text{ACCEPT}$ .

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Program C

Input  $P, w$

1. Replace every `print('no')` statement in  $P$  with `print('yes')`
1. if  $Q(P, w) == \text{'yes'}$ :
2.     `print('yes')`
3. else
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## Proof (cont.)

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We have to make sure that our reduction is correct by considering two cases.

Case 1: when  $P(w)$  halts.

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Case 1: when  $P(w)$  halts.

Case 2: when  $P(w)$  does not halt.

Since in both cases,  $C$  answers correctly, we know that given program  $Q$  deciding ACCEPT, we can construct a program  $C$  that decides HALT. However, we know that HALT is undecidable; thus, we reach a contradiction. We conclude that ACCEPT is also undecidable. □

# Reduction from HALT to ACCEPT in picture



## How about REJECT?

Let

$$\text{REJECT} = \{(P, w) \mid P \in \mathbb{P} \text{ and } P \text{ rejects } w\}.$$

## How about NOTHALT?

Let

$$\text{NOTHALT} = \{(P, w) \mid P \in \mathbb{P} \text{ and } P(w) \text{ does not terminate}\}.$$

## Language of program $P$

For a python program  $P$ , let  $L(P)$  be the set of all strings that  $P$  accepts, i.e.,

$$L(P) = \{w \in \Sigma^* \mid P(w) = \text{yes}\}.$$

Let

$$\text{ALL} = \{P \in \mathbb{P} \mid L(P) = \Sigma^*\}.$$

## Lemma 3

*ALL is undecidable.*

## Proof.

We prove by reduction from `HALT`. Assume that `ALL` is decidable, i.e., there is a python program `Q` that decides `ALL`. We construct program `C` that decides `HALT` as follows

Program `C` (input: `P,w`)

1. Construct another program `R` from `P` and `w`:
  - | Program `R` (input: `x`)
  - | 1. Run program `P` on input `w`, suppressing any output from `P`
  - | 2. Accept `x`
2. if `Q(R) == 'yes'`:
3.     return 'yes'
4. else: return 'no'

## Proof (cont.)

Program C (input:  $P, w$ )

1. Construct another program R from P and w:
  - | Program R (input:  $x$ )
    - | 1. Run program P on input  $w$ , suppressing any output from P
    - | 2. Accept  $x$
2. if  $Q(R) == \text{'yes'}$ :
3.     return 'yes'
4. else: return 'no'

To ensure the correctness, we have to consider two cases.

Case 1: when  $P(w)$  halts.

## Proof (cont.)

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To ensure the correctness, we have to consider two cases.

Case 1: when  $P(w)$  halts.

Case 2: when  $P(w)$  does not halt.

Since we can construct a program for HALT using a program that decides ALL, but HALT is undecidable; therefore, we conclude that ALL is undecidable. □

# EMPTY

Let

$$\text{EMPTY} = \{P \in \mathbb{P} \mid L(P) = \emptyset\}.$$



## Lemma 4

`EMPTY` is undecidable.

### Proof.

We prove by reduction from `HALT`. Assume that `EMPTY` is decidable, i.e., there is a python program  $Q$  that decides `EMPTY`. We construct program  $C$  that decides `HALT` as follows

Program  $C$  (input:  $P, w$ )

1. Construct another program  $R$  from  $P$  and  $w$ :
  - | Program  $R$  (input:  $x$ )
  - | 1. Run program  $P$  on input  $w$ , suppressing any output from  $P$
  - | 2. Accept  $x$
2. if  $Q(R) == \text{'yes'}$ :
3.     return 'no'
4. else: return 'yes'

Since we can construct a program for `HALT` using a program that decides `EMPTY`, but `HALT` is undecidable; therefore, we conclude that `EMPTY` is undecidable. □

## Lemma 5

Let  $EQ = \{(P_1, P_2) \mid P_1, P_2 \in \mathbb{P} \text{ and } L(P_1) = L(P_2)\}$ .  $EQ$  is undecidable.

### Proof.

We prove by reduction from  $ALL$ . Assume that  $EQ$  is decidable, i.e., there is a python program  $Q$  that decides  $EQ$ . We construct program  $C$  that decides  $ALL$  as follows

Program C (input: P)

1. Construct another program R:
  - | Program R (input: x)
  - | 1. Accept x
2. if  $Q(P, R) == \text{'yes'}$ :
3.     return 'yes'
4. else: return 'no'

Since we can construct a program for  $ALL$  using a program that decides  $EQ$ , but  $ALL$  is undecidable; therefore, we conclude that  $EQ$  is undecidable. □

## Another proof for EQ

### Proof.

We prove by reduction from `EMPTY`. Assume that `EQ` is decidable, i.e., there is a python program `Q` that decides `EQ`. We construct program `C` that decides `EMPTY` as follows

Program `C` (input: `P`)

1. Construct another program `R`:
  - | Program `R` (input: `x`)
  - | 1. Reject `x`
2. if `Q(P,R) == 'yes'`:
3.     return 'yes'
4. else: return 'no'

Since we can construct a program for `EMPTY` using a program that decides `EQ`, but `EMPTY` is undecidable; therefore, we conclude that `EQ` is undecidable. □

## Lemma 6

Let  $\text{HELLO} = \{P \in \mathbb{P} \mid L(P) = \{\text{hello}\}\}$ . *HELLO is undecidable.*

## INCORRECT PROOF.

We prove by reduction from EQ. Assume that EQ is decidable, i.e., there is a python program  $Q$  that decides EQ. We construct program  $C$  that decides HELLO as follows

Program C (input: P)

```
1. Construct another program R:
    | Program R (input: x)
    | 1.  if x == 'hello':
    | 2.    print('yes')      # accept x
    | 3.  else
    | 4.    print('no')       # reject x
2. if Q(P,R) == 'yes':
3.     return 'yes'
4. else: return 'no'
```



## Lemma 7

Let  $\text{HELLO} = \{P \in \mathbb{P} \mid L(P) = \{\text{hello}\}\}$ . *HELLO is undecidable.*

## Proof

We prove by reduction from **HALT**. Assume that **HELLO** is decidable, i.e., there is a python program  $Q$  that decides **HELLO**. We construct program  $C$  that decides **HALT** as follows

Program  $C$  (input:  $P, w$ )

1. Construct another program  $R$ :
  - | Program  $R$  (input:  $x$ )
  - | 1. if  $x \neq \text{'hello'}$ :
  - | 2.      $\text{print('no')}$      # reject  $x$
  - | 3. Replace any output statements from  $P$
  - | 4. Run the modified  $P$  on  $w$
  - | 5.  $\text{print('yes')}$      # accept  $x$
2. if  $Q(R) == \text{'yes'}$ :
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## Proof (cont.)

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We consider two cases:

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Since we can construct a program that decides HALT given a program that decides HELLO, but HALT is undecidable. We conclude that HELLO is also undecidable. □



# Python as computation

Do you believe in this assumption:

**Anything that a computer can do can be written as a python program.**

# Turing machines

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**Anything that a computer can do can be carried out using Turing machines.**

**Any possible computation can be performed by Turing machines.**

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# Turing Machines

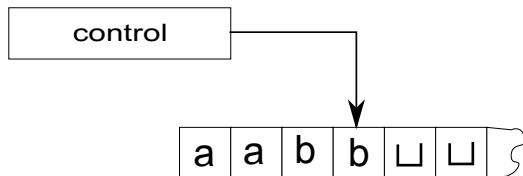
- ▶ Proposed by Alan Turing in 1936.
- ▶ A finite automaton with an **unlimited** memory with **unrestricted** access.
- ▶ Can perform any tasks that a computer can. (we'll see)
- ▶ However, there are problems that TM can't solve. These problems are beyond the limit of computation.



# Components

- ▶ An infinite **tape**.
- ▶ A tape head that can
  - ▶ **read and write** to the tape, and
  - ▶ **move** around the tape.

# Schematic



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- ▶ At the end of the computation, the machine outputs **accept** or **reject**, by entering accept state of reject state. (After changing, it halts.)
- ▶ It can go on forever (not entering any accept or reject states).



# Examples

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- ▶ So,  $\delta$  is in the form:  $Q \times \Gamma \rightarrow Q \times \Gamma \times \{\text{LEFT}, \text{RIGHT}\}$
- ▶ E.g., if  $\delta(q, a) = (r, b, \text{LEFT})$ , then if the machine is in state  $q$  and reads  $a$ , it will change its state to  $r$ , write  $b$  to the tape and move to the left.



# Definition

## Definition (Turing Machine)

A **Turing machine** is a 7-tuple,  $(Q, \Sigma, \Gamma, \delta, q_0, q_{accept}, q_{reject})$ , where  $Q, \Sigma, \Gamma$  are finite sets and

1.  $Q$  is the set of states,
2.  $\Sigma$  is the input alphabet not containing the **blank symbol**  $\sqcup$ ,
3.  $\Gamma$  is the tape alphabet, where  $\sqcup \in \Gamma$  and  $\Sigma \subset \Gamma$ ,
4.  $\delta : Q \times \Gamma \rightarrow Q \times \Gamma \times \{\text{LEFT}, \text{RIGHT}\}$  is the transition function,
5.  $q_0 \in Q$  is the start state,
6.  $q_{accept} \in Q$  is the accept state, and
7.  $q_{reject} \in Q$  is the reject state, where  $q_{accept} \neq q_{reject}$ .

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# Variants of Turing Machines

- ▶ There are many alternative definitions of TM's.
- ▶ They are called **variants** of TM's.
- ▶ They all have the same power. This demonstrates the **robustness** in the definition of TM's. Also, this is an evidence that TM's “capture” the idea of computation (because whatever computing machine we can think of they are all equivalent to TM's).

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- ▶ Does this give TM's more power?
- ▶ Not really. We can convert a TM with “stay put” to a standard TM as follows.
  - ▶ For any “stay put” transition, we replace with two transitions: “right” and “left”.

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- ▶ E.g., if  $\delta(q_i, a_1, \dots, a_k) = (q_j, b_1, \dots, b_k, \text{LEFT}, \text{RIGHT}, \dots, \text{LEFT})$  then if the machine is at state  $q_i$  and each head on tape  $i$  reads symbol  $a_i$ , it'll write  $b_i$  on each tape  $i$ , change state to  $q_j$  and move each head accordingly.

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# Nondeterministic Turing Machines

- ▶ A nondeterministic Turing machine can make “nondeterministic” move.
- ▶ As expected, its transition function has the form

$$\delta : Q \times \Gamma \rightarrow \mathcal{P}(Q \times \Gamma \times \{\text{LEFT}, \text{RIGHT}\}).$$

- ▶ Again, we view the computation of a nondeterministic Turing machine as a tree, where each branching corresponds to the place where the TM can make different moves.
- ▶ Can nondeterminism help?

# Equivalence in Power

- ▶ **Should I write programs in C or Pascal?**

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# Equivalence in Power

- ▶ **Should I write programs in C or Pascal?**
- ▶ **Should I write programs in Python or Prolog?**
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They are all the same, in terms of computability

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They are all the same, in terms of computability

Since you can write a C interpreter in Pascal and Pascal interpreter in C, what you can do in C, you can do in Pascal.

# Turing machine

If you believe that Turing machines are ultimate model of computing, all those programming languages are equivalent because they all can simulate Turing machines (and they runs on Turing machines).



# Two sides of a coin

- ▶ Computers are powerful

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- ▶ Computers are powerful (???)

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  - ▶ Maybe there's a limitation with “this” computer, but “other” computers might be able to do that thing.
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  - ▶ Maybe there's a limitation with “this” computer, but “other” computers might be able to do that thing.
  - ▶ We want to be able to say that **for all** computers. In fact, **for any “thinkable”** computers.

What is a computer?



What is a computer?  
Something that computes?

What is a computer?  
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What is computation?

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What is an algorithm?

# Hilbert's problems

Mathematician David Hilbert asked:

"Find a process according to which it can be determined by a finite number of operations if a given polynomial has integral root"

## To say NO

We need an argument (a mathematical proof) that covers all possible “processes” or all “computations”.

# Possible definitions

- ▶ Church's  $\lambda$ -calculus
- ▶ Turing's machines



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- ▶ Turing's machines

They both turned out to be **equivalent**.

## Church-Turing thesis

Turing machine algorithms = intuitive notion of algorithms

## Final answer to Hilbert

No, there doesn't exist any algorithm for determining if a polynomial has integral root.