

From last Time

Proving

$L_{\text{Halt}} = \{ (\alpha, x) : M_\alpha(x) \text{ halts} \}$
is undecidable

Proof: Reduction to

$L_{\text{uc}} = \{ \alpha : [M_\alpha(\alpha) = 0 \text{ or } \text{does not halt}] \}$
 $\rightarrow$ This ^{is} not recognizable

• Suppose L_H is decidable

• $\exists$ TM M_H that decides

if

$$\Rightarrow \underline{M_H(x, x)} = \begin{cases} 1 & \text{if } M_x(x) \text{ halts} \\ 0 & \text{if not} \end{cases}$$

• Now: Build $\hat{M}$ which decides L_{uc}

$$\hat{M}(x) = \begin{cases} \underline{1} & \text{if } M_x(x) = \overline{0} \\ & \text{or does not halt} \\ 0 & \text{if } M_x(x) = 1 \end{cases}$$

↳ Use M_H to build this

$$\hat{M}(x) =$$

(1) Run $M_H(x, x)$ $\neg M_x(x)$

② If $M_H(x, x) = 1$ ^{halts}

②.1 Check if $M_d(x) = 0$
- Output 1

②.2 If not
- Output 0

③ If $M_H(x, x) = 0$
Output 1

• $\hat{M}$ is a decider for L_{uc}

• But L_{uc} is undecidable $\square$

- Rice's Theorem (informally)

- All non-trivial properties
about programs are
undecidable

Efficient Computation

- Complexity classes

↳ Decidable languages,
where you can decide
within a given
resource bound

- Ex : -Space-limited

-Time-limited

- Programs where you
read the input
once

⋮

Time-efficient Computations

- Def: Let $T: \mathbb{N} \rightarrow \mathbb{N}$ be a function.

We say a language L is in $DTIME(T)$ if and only if

$\boxed{\exists \text{ TM } M}$ which decides L in time $O(T)$.

$\forall x \in L : M(x) = 1$ in time $O(T(|x|))$

$\forall x \notin L : M(x) = 0$ in time $O(T(|x|))$.

- All TMs we've seen have been Deterministic

- The Class P poly-time

$$P = \bigcup_{c \in \mathbb{N}} \text{DTIME}(\underline{n^c})$$

↳ this is efficient

Example Problems in P

- ↗ Int mult: $x \cdot y = z$?
- are x, y relatively prime?
- Graph Connectivity

- Directed Graph Paths:
does there exist path
from $s \rightarrow t$?
- Does $A \underline{x} = b$?

- Church-Turing Thesis

- Every physically realizable
computational model
can be simulated by
a TM.

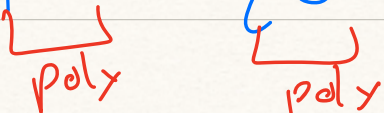
- Strong: simulation has only
polynomial overhead
→ X

Criticisms:

① why polynomial time?

- n^{100} algo? $n=2, 2^{100}$

- polynomials capture composition

$p(x) + q(x)$ is polynomial


$p(q(x))$ is polynomial

- historic/heuristic reasons

Ex. Someone gave
 n^{100} algo

→ someone else
improves it to
 n^5

- TMs simulate other models in poly-time

- P is worst-case

- You can have a problem where for 99% of input, it's time n
- 1% time n^{17}

Efficient Verification

Ex: Prime-factors

- Given large number

$N \in \mathbb{N}$, find all

prime factors $p_1 \dots p_k$ of N .

- Efficient verification

 - I give you

$p'_1, \dots, p'_k$

① Check if $N = p'_1 \cdot p'_2 \cdot \dots \cdot p'_k$

② Check if all $p'_1, \dots, p'_k$

are prime

$\in P$

Verifiable Languages

A language L is verifiable if $\exists$ a TM M_L such that

$$x \in L \iff$$

$$\exists w \in \{0,1\}^*$$

$$\text{such that } M_L(x, \underline{w}) = 1$$

$\uparrow$
witness /
certificate

L is efficiently verifiable

if $\exists$ TM M_L and polynomial p such that

$$x \in L \iff \exists w \in \{0,1\}^{p(|x|)} \text{ s.t.}$$

$$M_L(x, w) = 1$$

The Class NP

$NP = \left\{ \begin{array}{l} \text{all efficiently} \\ \text{verifiable languages} \end{array} \right\}$

Q : Is $P \subseteq NP$?

A : Yes! why?

If $L \in P$

$\exists M_L$ s.t. M_L decides
 L

$\Rightarrow \forall x : M_L(x) = 1$ if $x \in L$

$M_L(x) = 0$ if $x \notin L$

in polynomial time

→ Verifier Machine

$\hat{M}_2(x, \epsilon) \rightarrow$

Run $M_L(x)$

Central Problem

$P \stackrel{?}{=} NP$

widely believed that

$P \neq NP$

Alternate NP characterization

• Non-deterministic TMs

Def: A k -type non-det.

Turing Machine is

identical to a Def. TM,

except for the following

$$\textcircled{1} \delta: Q \times \Gamma^k \xrightarrow{|Q| \cdot |\Gamma|^{k-1} \cdot 3^k} P(Q \times \Gamma^{k-1} \times \{L, R, S\}^k)$$

$\nexists$ for DTM

$P(S)$ = all possible

subsets of
 S

$$|P(S)| = 2^{|S|}$$

$\textcircled{2}$ The TM non-det. chooses
next configuration

DTM

$M(x)$



decides
└

NTM

$\bar{M}(x)$



$O(T(x))$

decides
└

• All execution branches halt

• $\exists$ at least one branch

that accepts

$x \in L$

- For $x \notin L$,
all branches
reject

$NTIME(T) =$

{ all languages
decided by a time
 $O(T)$ NTM }

longest execution
branch has $O(T)$ length

Lemma:

$$NP = \bigcup_{c \in \mathbb{N}} NTIME(n^c)$$

Ex Prime factors

- Given N , find

k -prime factors of N

NTM $M^*(N)$

• Pick k prime

non-def $\rightarrow$ numbers $p_1, \dots, p_k$

part

• Check if $N = p_1 \cdot \dots \cdot p_k$

$$\bullet \text{ EXP } = \bigcup_{c \in \mathbb{N}} \text{DTIME}(2^{n^c})$$

Lemma:

$$\text{NP} \subset \text{EXP}$$

Proof: Enumerate all possible branches of the NTM, check for accept/reject

If NTM runs in time $T(n)$, then this runs in time $O(2^{T(n)})$ $\square$