

Theoretical Computer Science

Week 1

TCS / upper bound $\rightarrow$ algorithm $O(n^3) \rightarrow O(n \log n)$
lower bound $\rightarrow$ hardness $\Omega(n) \rightarrow \Omega(n \log n)$ comparison-base

definition: problem, computing model, computation

computability, tractability, randomness

P, NP

important: definition, theorem $\left\{ \begin{array}{l} \text{statement} \\ \text{proof idea} \\ \text{proof} \end{array} \right\}^*$

1. Problem

1. Given a weighted graph G , what is the MST? $\leftarrow$ delete an edge, check whether the weight increases or not $O(E)$

$\left\{ \begin{array}{l} \text{what is the weight of its MST?} \\ \text{and an integer } k, \text{ does } G \text{ have a ST with weight at most } k? \end{array} \right\} \leftarrow \text{binary search } k \quad O(\log B)$

decision problem $\leftarrow P$

Given a string w , is $w \in L$?

2. Given a string w , is $w \in L = \{\text{encode}(G, k) : G \text{ is a graph that has a ST with weight at most } k\}$

Language $L = \{\text{encoding of yes-instance of } P\}$

3. An alphabet is a finite set of symbols.

$\Sigma = \{0, 1\}$ $\Sigma = \{A, B, \lambda, Y\}$ $\Sigma = \{\}$ $\Sigma = \{A, \square, O, x\}$

(1) A string over Σ is a finite sequence of symbols from Σ .

(2) The length of a string w is symbols. $|w|$

(3) empty string ϵ , $|\epsilon| = 0$

(4) concatenation: $u = 010$, $v = 110$, $uv = 010110$

(5) exponentiation: $w^i = \underbrace{w \dots w}_i$ $w^0 = \epsilon$, $w^2 = w \cdot w$

(6) reversal: $w = 0011$, $w^R = 1100$

4. A language over Σ is a set of strings over Σ

(1) concatenation: $AB = \{uv : u \in A \text{ and } v \in B\}$ $A \circ \{\epsilon\} = A$

(2) exponentiation: $A^i = \underbrace{A \dots A}_i$, $A^0 = \{\epsilon\}$, $A^{i+1} = A \cdot A^i$

(3) $A^+ = \bigcup_{i \geq 1} A^i$, $A^* = \bigcup_{i \geq 0} A^i = A^+ \cup \{\epsilon\}$

(4) Σ^i : a set of string of length i consisting of symbols in Σ
 Σ^+ , Σ^*

(5) reversal: $A^R = \{w^R : w \in A\}$

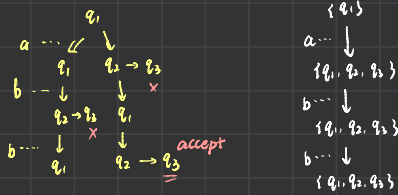
→

```
graph LR
    q1((q1)) -- "a,b" --> q1
    q1 -- "b" --> q2((q2))
    q2 -- "a,b" --> q3(((q3)))
```


(3) Theorem: given NFA $N \Rightarrow$ DFA M , $L(M) = L(N)$

$\Leftarrow$ $\rightarrow$ this way is obvious

Idea: $\Rightarrow$ DFA M simulates "tree-like" computation of NFA N .



NFA $N = (K, \Sigma, \Delta, S, F)$

DFA $M = (K', \Sigma, \delta, S', F')$

$K' = 2^K = \{Q \mid Q \subseteq K\}$

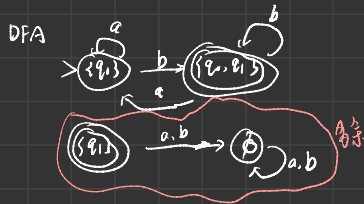
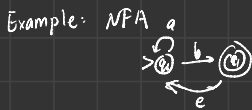
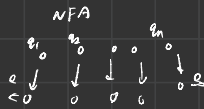
$F' = \{Q \subseteq K \mid Q \cap F \neq \emptyset\}$

$\forall q \in K, E(q) = \{p \in K \mid (q, e) \in \Delta \cap (p, e)\}$

$S' = E(S)$

$\delta(Q, a) = \bigcup_{q \in Q} \bigcup_{p \in E(q, a)} E(p)$

$L(M) = L(N)$

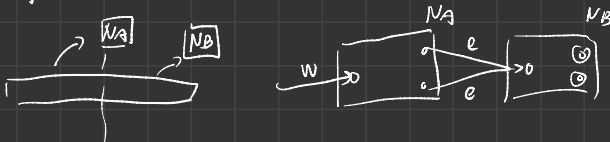


(4) Theorem:

A language is regular if and only if it is accepted by some NFA

(5) Theorem:

If A and B are regular, so is AB .



$N_A = (K_A, \Sigma, \Delta_A, S_A, F_A)$

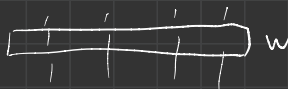
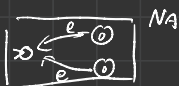
$N_B = (K_B, \Sigma, \Delta_B, S_B, F_B)$

$N_0 = (K_0, \Sigma, \Delta_0, S_0, F_0)$

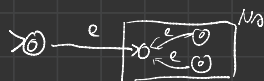
$K_0 = K_A \cup K_B$, $S_0 = S_A$, $F_0 = F_B$

$\Delta_0 = \Delta_A \cup \Delta_B \cup \{(q, e, s_B) \mid q \in F_A\}$

(6) Theorem: If A is regular, so is A^+ . $A^+ = A^1 \cup A^2 \cup A^3 \dots = \{w_1 w_2 \dots w_k \mid w_i \in A, k \geq 1\}$



(17) Theorem: If A is regular, so is A^*



2. Regular Expression (REX)

1) $R = a(aub)^*b$

$L(R) = \{w \in \{a,b\}^*, w \text{ starts with } a \text{ and ends with } b\}$

ϵ 表示空串, ϕ 表示不包含任何字符串

2) Atom: $\phi, L(\phi) = \phi, \epsilon$

$a \in \Sigma, L(a) = \{a\}$

Precedence: $* > \cup > \cdot$

Compos: $(\cup, \cdot, *)$

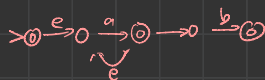
$R_1 \cup R_2, L(R_1 \cup R_2) = L(R_1) \cup L(R_2)$

$R_1 R_2, L(R_1 R_2) = L(R_1) L(R_2)$

$R^*, L(R^*) = (L(R))^*$

$ab^* \cup ba^* = (a(b^*)) \cup (b(a^*))$

example: a^*b



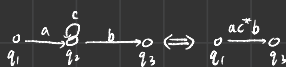
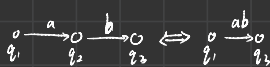
3) $\{w \in \{a,b\}^*, w \text{ has two occurrences of } ab\}$

$(aub)^* a (aub)^* a (aub)^*$

Week 3

1. NFA $\rightarrow$ REX

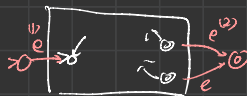
Idea: state elimination



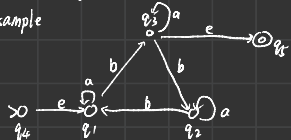
Simplify M so that

(1) no arc enters the initial state

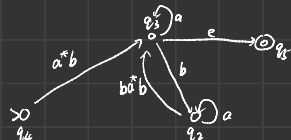
(2) unique final state, and no arc leaves it



Example

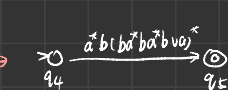


delete q_1



delete q_2

delete q_3



example: $R_{SS}^0 = \phi^*$ $\{ \epsilon \}$

$R_{35}^1 = \phi^*$ $\{ \epsilon \}$

$R_{33}^2 = \phi^* \cup \{a\}$ $\{ \epsilon, a \}$

Proof: Dynamic Programming

Input: Simplified NFA $M = (K, \Sigma, \Delta, S, F)$

1. $K = \{q_1, \dots, q_n\}, S = q_1, F = \{q_n\}$

2. $\forall p, \forall a, (p, a, q_m) \in \Delta$

3. $\forall p, \forall a, (q_n, a, p) \notin \Delta$

Subproblem:

for $i, j, k \in \{1, \dots, n\}$, let R_{ij}^k be a REX s.t.

$L(R_{ij}^k) = \{w \in \Sigma^* : (q_i, w) \vdash_M^* (q_j, \epsilon) \text{ with no intermediate state having index } > k\}$

Goal:

$$R_{i,j}^{n-2}$$

Base case $k=0$

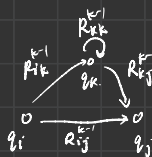
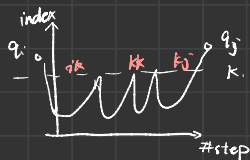
$$\text{if } i=j: R_{i,j}^0 = \phi^x \cup a_1 \cup a_2 \dots, (q_i, a_n, q_j) \in \Delta$$

$$\text{if } i \neq j: R_{i,j}^0 = a_1 \cup a_2 \cup \dots, (q_i, a_n, q_j) \in \Delta$$

Recurrence

$$\{R_{i,j}^{k-1}\}_{i,j} \rightarrow \{R_{i,j}^k\}_{i,j}$$

$$R_{i,j}^k = R_{i,j}^{k-1} \cup R_{i,k}^{k-1} (R_{k,k}^{k-1})^* R_{k,j}^{k-1}$$



Conclusion: To prove that L is regular:

DFA, NFA, REG

closure property: $\cup, \cap, \circ, \bar{A}, *$

2. Pumping Theorem

Pumping length

Let L be regular language. There exists an integer $p \geq 1$ such that $\forall w \in L$ which $|w| \geq p$ can be divided into three parts $w = xyz$, satisfying:

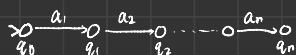
- 1) $|y| > 0$
- 2) for any $i \geq 0$, $xy^iz \in L$
- 3) $|xy| \leq p$

example: ab^*a , $p=3$

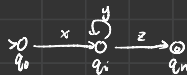
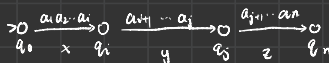
Proof: if L is finite, $p = \max_{w \in L} (|w| + 1)$

Assume L is infinite, $\exists$ DFA M accepts L . $p = \#$ states of M

$\forall w \in L$ with $|w| \geq p$. $w = a_1 a_2 \dots a_n$, $n \geq p$



$$\exists 0 \leq i < j \leq p, q_i = q_j$$



$$1) i < j \Rightarrow |y| > 0$$

$$2) \forall i \geq 0, xy^iz \in L$$

$$3) j = p \Rightarrow |xy| \leq p$$

3. Prove $\{0^n 1^n : n \geq 0\}$ is not regular

Proof: Assume it is regular, let p be the pumping length

consider $w = 0^p 1^p$. By pumping theorem, $w = xyz$, s.t.

- 1) $|y| > 0$
- 2) $xy^iz \in L$, for any $i \geq 0$
- 3) $|xy| \leq p$

From 1) 3), $y = 0^k$, for some $k \geq 1$, then $xy^2z = 0^{p+k} 1^p \notin L$

contradictory with (2)

ψ . Prove $\{w \in \{0,1\}^* : w \text{ has equal number of } 0\text{'s and } 1\text{'s}\}$ is not regular

assume L is regular $\Rightarrow L \cap 0^* 1^*$ is regular $\Rightarrow \{0^n 1^n : n \geq 0\}$

5.



$S \rightarrow aSb$ rules a, b, c : terminals

$$A \rightarrow C$$
$$A \rightarrow e$$
$$S \rightarrow aSb \rightarrow aaSbb \rightarrow aaAbb \rightarrow aacbb$$

V : a finite set of symbols

$\Sigma \subseteq V$: the set of terminals

V_2 : the set of non-terminals

$S \in V - \bar{Z}$: start symbol

$R \subseteq (V - \bar{Z}) \times V^*$: a finite set of rule $(A, w) \in R, A \rightarrow w$

1) for any $x, y, u \in V^*$, for any $A \in V - \Sigma$. $xAy \Rightarrow xuy$ if $(A, u) \in R$
 derive in one step

2) for any $w, u \in V^*$, $w \Rightarrow^* u$ if $w = u$ or $w \Rightarrow \dots \Rightarrow u$

terminal

a derivation from w to u of length n

(1) G generates $w \in \bar{Z}^*$ if $S \Rightarrow^* w$

$$L(G) = \{w \in \Sigma^* : G \text{ generates } w\}, \quad G \text{ generates } L(G)$$

example: (i) $\{0^n 1^n, n \geq 0\}$

$$S \rightarrow oS, \quad S \rightarrow e$$

(4) $\{w \in \{a,b\}^*, w = w^R\}$

$$\begin{cases} S \rightarrow aSa \\ S \rightarrow bSb \\ S \rightarrow e \\ S \rightarrow a \\ S \rightarrow b \end{cases} \Rightarrow S \rightarrow aSa | bSb | e | a | b$$

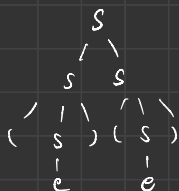
Week 4

→ leftmost derivation

- $S \Rightarrow SS$
 $S \Rightarrow (S)S \Rightarrow ()S \Rightarrow () (S) \Rightarrow () ()$
 $S \Rightarrow (S)$
 $S \Rightarrow SS \Rightarrow S(S) \Rightarrow S() \Rightarrow (S)() \Rightarrow () ()$
 $S \Rightarrow e$

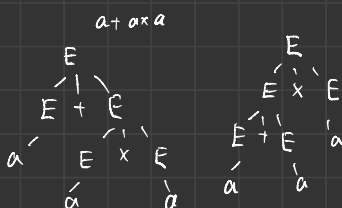
→ rightmost derivation

Parse tree:



$()()$: the yield of the parse tree

- $E \rightarrow E + E$
 $E \rightarrow E \times E$
 $E \rightarrow (E)$
 $E \rightarrow a$

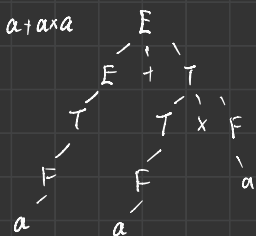


→ two different

ambiguous

- ① grammar 导致的
- ② language 导致的

- $E \rightarrow E + T$
 $E \rightarrow T$
 $T \rightarrow T \times F$
 $T \rightarrow F$
 $F \rightarrow (E)$
 $F \rightarrow a$



E: Expression

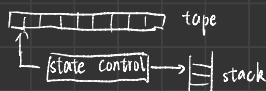
T: term

F: factor

- $\{a^i b^j c^k : i=j \text{ or } j=k\}$ 所有生成此语言的 CFG 都有歧义
 ↳ inherent ambiguous

- Pushdown Automata $\iff$ Context-free language

PDA = NFA + stack

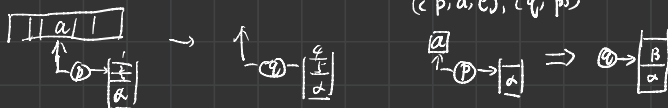


A PDA is 6-tuple $P = (K, \Sigma, T, \Delta, s, F)$

- K : a finite set of state
- Σ : tape alphabet
- T : stack alphabet
- s : initial state
- F : a set of final state
- Δ : transition relation, a finite subset of

$(K \times (\Sigma \cup \{e\}) \times T^*) \times (K \times T^*)$

↓ current state ↓ current symbol ↓ the top part of stack ↓ next state ↓ pop now push a string onto the stack

$$(c p, a, e), (q, p)$$


yields in one step

$(p, x, a) \stackrel{+}{\sim}_p (q, y, b)$ if $\exists (p, a, r), (q, y) \in \Delta$ st $x = ay$, $a = r\tau$ and $b = y\tau$ for some $\tau \in T^*$

P accepts a string $w \in \Sigma^*$ if $(s, w, e) \vdash_P^* (q, e, e)$ for some $q \in F$

$$L(P) = \{w \in \Sigma^* : P \text{ accepts } w\} \quad , \quad P \text{ accepts } L(P)$$

7. Ex. $L = \{w \in \{0,1\}^* : \#0's = \#1's \text{ in } w\}$

if stack is empty or the top is 0

push (0)

```
else // top is 1
```

popci7

When read a 1 :

Proof: Version 1:

$$K = \{s, q, f\}, \quad s = \{s\}, \quad f = \{f\}$$
$$\Sigma = \{0, 1\}, \quad \Gamma = \{0, 1, \$\}$$
$$\Delta = \{(s, e, e), (q, \$), ((q, 0, \$), (q, 0\$)), ((q, 0, 0), (q, 00)), ((q, 0, 1), (q, e))\}$$

1. 同构 $\dots, (q, e, f), (f, e)) \}$

Version 2:

$$K = \{q\}, S = q, F = \{q\}$$

利用 PDA 可以猜 like NFA

$$\Sigma = \Gamma = \{0, 1\}$$
$$\Delta = \{(1, 0, e), (q, 0), (1, q, 0, 0), (q, 0, 0), (1, q, 0, 1), (q, e), \dots\}$$

version 3:

3:

0, 0 $\rightarrow$ 0
0, 0 $\rightarrow$ 00
0, 1 $\rightarrow$ e
1, e $\rightarrow$ 1
1, 1 $\rightarrow$ 11
1, 0 $\rightarrow$ e

Week 5

for input

a	a	b	b
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1. $CFG \longrightarrow PDA$

$$S \rightarrow aSb \quad S \rightarrow e$$

Idea :

1. in stack, non-deterministically generate a string according CFG
2. compare it to input
3. accept it if they match

Given a CFG, $G = (V, \Sigma, R, S)$, construct a PDA, $P = (K, \Sigma, \Gamma, \Delta, S, F)$, such that $L(P) = L(G)$

$$K = \{s, f\}, \quad F = \{f\}, \quad \Gamma = V,$$

$$\Delta = \{ (s, s, e, e), (f, s) \}, \\ (f, e, A), (f, u) \}, \forall (A, u) \in R \\ (f, a, a), (f, e) \}, \forall a \in \Sigma \}$$

2. $PDA \rightarrow CFG$

↓
simple PDA

1) Def.

A PDA $P = (K, \Sigma, \Gamma, \Delta, S, F)$ is simple if

$$1) |F| = 1$$

2) for each transition $(\alpha, p, a, \beta) \in \Delta$, either $\alpha = e$ and $|\beta| = 1$ // push a symbol
or $|\alpha| = 1$ and $\beta = e$ // pop a symbol

2) $PDA \rightarrow$ simple PDA

① if $|F| = 0$, $L(P)$ 为 $\emptyset$, $PDA \rightarrow CFG$

② if $|F| > 1$, create a new state f'

for each $q \in F$

create a transition $((q, e, e), (f', e))$

③ 2.3.1 goal: $\alpha = e$ or $\beta = e$

for each $(\alpha, p, a, \beta), (q, \beta)$ with $\alpha \neq e$ and $\beta \neq e$

create a state r

replace it with

$$(\alpha, p, a, \beta), (r, e) \text{ and } (r, e, e), (q, \beta)$$

2.3.2 for each $(\alpha, p, a, \beta), (q, e)$ with $\alpha = q_1 \dots q_k$

create $k-1$ new states $r_1, \dots, r_{k-1}$

replace it with

$$(\alpha, p, a, q_1), (r_1, e), (r_1, e, q_2), (r_2, e)$$

⋮

$$((r_{k-1}, e, q_k), (q, e))$$

2.3.3 for each $(\alpha, p, a, e), (q, \beta)$ with $\beta = c_1 \dots c_k$

注意: push 顺序由 $c_k, c_{k-1} \dots$ 到 c_1

2.3.4 for each $(\alpha, p, a, e), (q, e) \in \Delta$

create a new state r

let $b \in \Gamma$

replace it with

$$(\alpha, p, a, e), (r, b), (r, e, b), (q, e)$$

3) simple PDA $\rightarrow$ CFG

Given a simple PDA $P = (K, \Sigma, \Gamma, \Delta, S, \{f\})$

construct a CFG $G = (V, \Sigma, S, R)$

subproblems

Non-terminal: $\{A_{pq} : \text{for any } p, q \in K\}$

$A_{pq} \Rightarrow^* w \in \Sigma^*$ if and only if $(p, w, \epsilon) \vdash_p^* (q, \epsilon, \epsilon)$

so $S = A_{sf}$

$A_{pp} \Rightarrow \epsilon \quad \forall p \in K$

有可能遇到死锁

如

$S \rightarrow A$
 $A \rightarrow a$
 $S \rightarrow B$

for any $p, q \in K$

$A_{pq} \rightarrow A_{pr}A_{rq}$ for any $r \in K$

$A_{pq} \rightarrow aA_{p'q'}b$

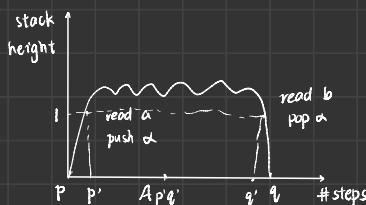
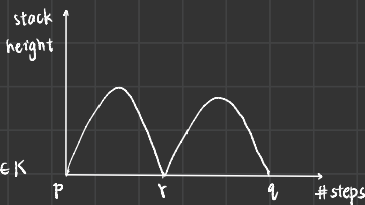
L(G) = $\{a\}$

B 之后就不行了

for any p, q, a, b satisfying

$((p, a, \epsilon), (p', a)) \in \Delta$

$((q', b, \epsilon), (q, \epsilon)) \in \Delta$



3. 推论: prove context-free 可用 PDA/CFG

4. $\{w \in \{a, b\}^* : \#a's = 2\#b's \text{ in } w\}$

$2\#b's - \#a's = ?$

stack $\rightarrow$ unary counter

$++$
 $--$

PDA = $(K, \Sigma, \Gamma, \Delta, S, F)$

$K = \{s\}$, $F = \{s\}$, $\Sigma = \{a, b\}$, $\Gamma = \{+, -\}$

$\Delta = \{(s, b, \epsilon), (s, ++), (s, b, -), (s, +), (s, b, --), (s, \epsilon),$

$(s, a, \epsilon), (s, -), (s, a, +), (s, \epsilon)\}$

5. Theorem:

Every regular language is context-free.

反之, context-free 的不一定是 regular

simply, NFA $\rightarrow$ PDA

harder: DFA $\rightarrow$ CFG $M = (K, \Sigma, \delta, s, F)$, $G = (V, \Sigma, s, R)$

$\forall q_i \in K \Rightarrow Q_i \in (V - \Sigma)$

$Q_i \Rightarrow^* w$ iff $(q_i, w) \vdash_m^* (q, \epsilon)$ for $q \in F$

$S = Q_0$

$\forall q_i \in F, Q_i \Rightarrow \epsilon$ base case

for any $q_i \in K$, if $\delta(q_i, a) = q_j$, $Q_i \rightarrow aQ_j$

6. The family of context-free languages is closed under $\cup$ and $*$

but not closed under $\cap$, -

A, B context-free

$$G_A = (V_A, \Sigma, S_A, R_A), \quad G_B = (V_B, \Sigma, S_B, R_B)$$

1) $A \cup B \quad S \rightarrow S_A \mid S_B$

4) $A = \{a^i b^j c^k : i=j\}$

2) $A \circ B \quad S \rightarrow S_A S_B$

$B = \{a^i b^j c^k : j=k\}$

3) $A^* \quad \begin{cases} S \rightarrow \epsilon \\ S \rightarrow S S_A \end{cases}$

$A \cap B = \{a^i b^j c^k : i=j=k\} \leftarrow$ not context-free

5) $A \cap B = \overline{A \cup B}$

Week 6

1. Pumping Theorem for CFL

Let L be a context-free language. There exists an integer $p > 0$, such that any $w \in L$ with $|w| \geq p$ can be divided into five pieces $w = uvxyz$ satisfying:

1) $uv^i xy^i z \in L$ for any $i \geq 0$

2) $|v| + |y| > 0$

3) $|vxy| \leq p$

example: $\{a^n b^n : n \geq 0\}$: $p=2$ eaebe

Idea:



$$S \xRightarrow{*} u \alpha z \xRightarrow{*} uv \alpha y z \xRightarrow{*} uv^2 xy^2 z$$



$$\rightarrow uv^2 xy^2 z \in L$$



$$\rightarrow uv^2 xy^2 z \in L$$

类似地，都成立

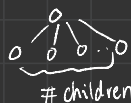
Proof:

does not contain $A \rightarrow A$

$\exists$ a CFG, $G = (V, \Sigma, S, R)$ generate L

distinct non-terminals = $|V - \Sigma|$

required tree height $\geq |V - \Sigma| + 2$ → contain leaf (terminal)



children

$$\text{fanout} \leq \max \{ |u| : (A, u) \in R \}$$

pick the smallest parse tree that yields w

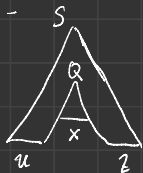
So, let $p = b^{|V - \Sigma| + 1}$. If a tree of n nodes has fanout $\geq b$

$$\Rightarrow \text{height} \geq \log_b n + 1$$

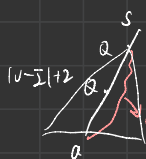
longest path has at least $|V - \Sigma| + 1$ non-terminals

$\Rightarrow$ some non-terminal appears at least twice then repeat the graph above





If $|v| + |y| = 0$, then there exists smaller tree
contradictory!
so $|v| + |y| > 0$



pick the lowest Q that appears twice on the path

every non-terminal appears
at most once

$$b^{10-1+1} \leq p$$

2. $\{a^n b^n c^n, n \geq 0\}$ is not context-free.

Let p be the pumping length given by the pumping theorem.

Pick $w = a^p b^p c^p \in L$

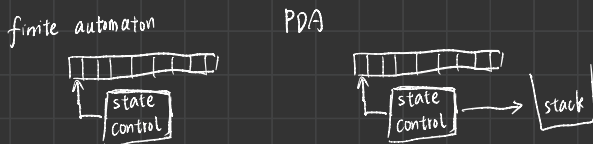
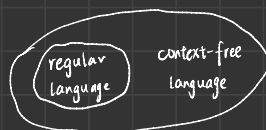
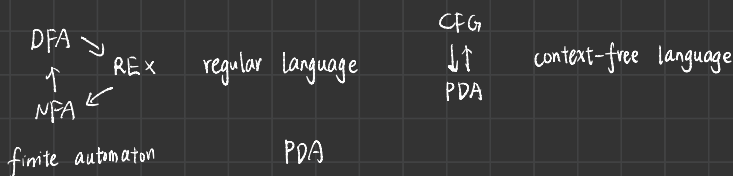
By pumping theorem, $w = uvxyz$ st

(1) $uv^i xy^i z \in L$, for any $i \geq 0$ (2) $|v| + |y| > 0$ (3) $|uxy| \leq p$

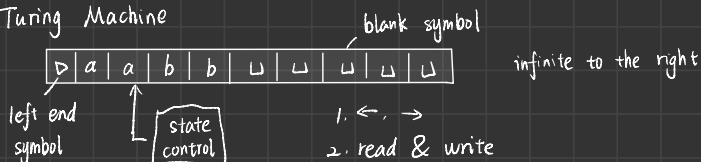
From (3), v and y contain either a or c , not both

$\Rightarrow uv^2 xy^2 z \notin L$, contradicting with (1)

Short Review



3. Turing Machine



A Turing Machine is a 5-tuple $M = (K, \Sigma, \delta, s, H)$

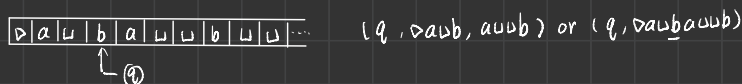
- K : a finite set of states
- Σ : an alphabet (containing $\triangleright$ and $\sqcup$)
- s : initial state
- $H = \{y, n\} \subseteq K$: halting states
- $\delta: (K-H) \times \Sigma \rightarrow K \times \{\bar{L}, \bar{U}, \bar{R}\} \times \Sigma$
 - current state
 - next state
 - write
 - moving

satisfying: (1) for any $q \in K-H$, $\delta(q, \triangleright) = (p, \rightarrow)$ for some $p \in K$

(2) for any $q \in K-H$, for any $a \in \Sigma$,

if $\delta(q, a) = (p, b)$, then $b \neq \triangleright$ $\rightarrow$ left-end symbol ∇ is -

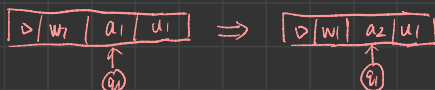
Configuration:



A configuration is a member of $K \times \mathcal{V}(\Sigma - \{\triangleright\})^* \times (\Sigma - \{\triangleright, \sqcup\})^* \times \{\triangleright, \sqcup\}^*$

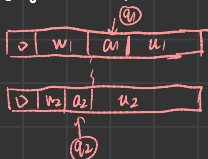
We say $(q_1, \triangleright w_1 a_1 u_1) \vdash_M (q_2, \triangleright w_2 a_2 u_2)$ if

writing (1) $\delta(q_1, a_1) = (q_2, a_2)$ and $a_2 \in \Sigma - \{\triangleright\}$ and $w_2 = w_1$ and $u_2 = u_1$



moving left

(2) $\delta(q_1, a_1) = (q_2, \leftarrow)$ $w_1 = w_2 a_2$, $u_2 = a_1 u_1$

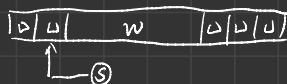


right 同理

(3) M halts whenever it reaches a halting configuration.

Given an input w

initial configuration $(s, \triangleright \sqcup w)$



M accepts the input w if $(s, \triangleright \sqcup w) \vdash_M^* (q, \triangleright \sqcup a \sqcup w)$

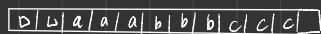
M rejects the input w if $(s, \triangleright \sqcup w) \vdash_M^* (n, \triangleright \sqcup a \sqcup w)$

Given a TM M , $L(M) = \{w \in (\Sigma - \{\triangleright, \sqcup\})^* \mid M \text{ accepts } w\}$

accept $\left\{ \begin{array}{l} \text{reject} \\ \text{looping} \end{array} \right.$ M decides $L(M)$ if

recursive language $\left\{ \begin{array}{l} \text{accept if } w \in L(M) \\ \text{reject if } w \notin L(M) \end{array} \right.$ semidecides $L(M)$ if $\left\{ \begin{array}{l} \text{accept if } w \in L(M) \\ \text{reject or looping if } w \notin L(M) \end{array} \right.$ $\rightarrow$ recursively enumerable language

4. TM decides $\{a^n b^n c^n \mid n \geq 0\}$



(1) check if it is the form $a^* b^* c^*$ 是否符合 a.b.c

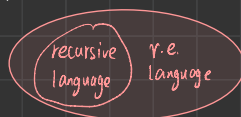
(2)

Week 7

1. Given M , $L(M) = \{w \mid M \text{ accepts } w\} \rightarrow M$ semidecides $L(M)$

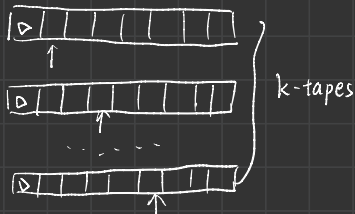
If M halts on every time, then M decides $L(M)$

Every recursive language must be recursively enumerable.



Extensions of TM

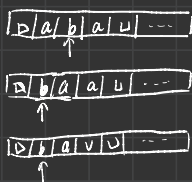
1. multiple tapes



$$\delta: (K-1) \times \Sigma^k \rightarrow K \times (\Sigma - \{\emptyset\} \cup \{\leftarrow, \rightarrow\})$$

和原机的表达能力相同

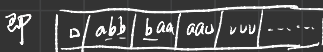
Idea: 3-tape



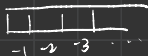
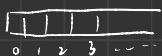
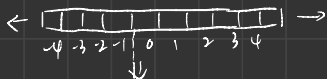
$$|\Sigma| = (2|\Sigma|)^3$$

↳ 2为肩下划线或肩下划线

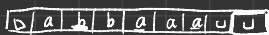
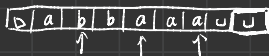
single-tape



2. Two-way infinite tape

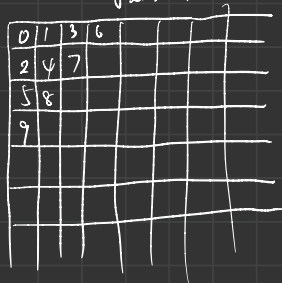


3. Multiple head



4. 2D-tape

可数无穷大



5. random access



6. Non-deterministic TM (NTM): A NTM is a 5-tuple $(K, \Sigma, \Delta, S, H)$

• K

• Σ

• S

• H

• Δ : a "finite" subset of $((K-1) \times \Sigma) \times (K \times (\Sigma - \{\emptyset\} \cup \{\leftarrow, \rightarrow\}))$

DTM



NTM



M decides L if

只能有有限个分支, 不能写成 every branch halts

(1) for any w , there is an integer N , depending on w and M such that

every branch halts with N steps

(2) if $w \in L$, $\exists$ some branch accepts w .

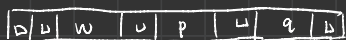
if $w \notin L$, every branch rejects w .

M semidecides L if for any input w .

(1) if $w \in L$, $\exists$ some branch accepts w .

(2) if $w \notin L$, no branch accepts w .

example: Let $C = \{100, 110, 1000, \dots\}$ 为所有合数的集合



non-deterministically
generate p and q

if $w=pq$, accept; otherwise, reject

7. Theorem: Every NTM can be simulated by a DTM.

Sketch: a NTM N semidecides $L \rightarrow$ a DTM M semidecides L

given input w , $w \in L$ iff some branch accepts w

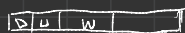
(some node is in state y)



Dfs $\times$ (looping)

Bfs $\checkmark$

3-tape DTM:



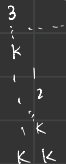
store the input



simulate NTM



enumerate all possible choice



枚举每一层选择第 k 个信息

8. Church-Turing Thesis

Intuition of Algorithm is equivalent to Turing Machine.

9. Fact1: Any finite set can be encoded

$\{a_1, \dots, a_n\} \rightarrow a_0000 \dots a_0000 \dots a_1 \dots$
 $\underbrace{\hspace{1.5cm}}_{\log n}$

Fact 2: Any finite tuple whose elements are finite sets can be encoded

$(A, B, C, D) \rightarrow a_000 \dots a_000 \dots a \dots b \dots c \dots d \dots$

E.x. $G = (V, E) \rightarrow "G"$ $M = (K, \Sigma, \delta, s, H) \rightarrow "M"$

10. $L = \{ "G" : G \text{ is a connected graph} \}$

$M =$ on input "G"

0. if the input is illegal, reject (by default)
1. select a node of G and mark it.
2. repeat the following
3. for each marked node
4. mark all of its neighbors
5. if all the nodes are marked
accept
6. else
reject

11. Problems

1.1) $R_1: A_{DFA} = \{ "D" "w" : D \text{ is a DFA that accepts } w \}$

$M_{R_1} =$ on input "D" "w"

1. run D on w
2. if D accepts w
accepts "D" "w"
3. else D rejects w
rejects "D" "w"

1.2) $R_2: A_{NFA} = \{ "N" "w" : N \text{ is a NFA that accepts } w \}$

$M_{R_2} =$ on input "N" "w"

1. convert N to an equivalent DFA D
2. run M_{R_1} on "D" "w"
3. return the result of M_{R_1}

1.3) $R_3: A_{REX} = \{ "R" "w" : R \text{ is a regular expression with } w \in L(R) \}$

$M_{R_3} =$ on input "R" "w"

1. convert R into an equivalent NFA N
2. run M_{R_2} on "N" "w"
3. return the result of M_{R_2}

1.4) $R_4: E_{DFA} = \{ "D" : D \text{ is a DFA with } L(D) \neq \emptyset \}$

$M_{R_4} =$ on input "D"

1. run DFS on the state diagram of D
2. 若有 path 则 reject, 否则 accept

到不了 final

①

②

③

1.5) $R_5: E_{DFA} = \{ "D_1" "D_2" : D_1 \text{ and } D_2 \text{ are two DFAs with } L(D_1) \neq L(D_2) \}$

Symmetric different

$$A \oplus B = (A \cup B) - (A \cap B)$$

1. $A=B$ if and only if $A \oplus B = \emptyset$



$$2. A \oplus B = (A \cup B) \cap (\overline{A \cap B}) \\ = (A \cup B) \cap (\overline{A} \cup \overline{B})$$

M_{B_2} : on input " D_1 " " D_2 "

1. construct a DFA D^* with $L(D^*) = L(D_1) \oplus L(D_2)$
2. run M_{B_2} on " D^* "

Week 8

1. $A_{DFA} = \{ \langle D, w \rangle : D \text{ is a DFA that accepts } w \}$

D is a DFA. $L(D) = \{ w : D \text{ accepts } w \}$

不同. 第2个指定了 D

$w \in L(D) \Leftrightarrow D \text{ accepts } w \Leftrightarrow \langle D, w \rangle \in A_{DFA}$

A_{DFA} is recursive $\Leftrightarrow L(D)$ is recursive

2. $A_{CFG} = \{ \langle G, w \rangle : G \text{ is a CFG that generates } w \}$

A CFG is in chomsky normal form (CNF) if every rule is one of the following forms:

1. $S \rightarrow \epsilon$

2. $A \rightarrow BC$ $B, C \in V - \bar{\Sigma} - \{S\}$ 可以证明所有CFG都可以被表示为CNF

3. $A \rightarrow a$

generate $|w| = n \geq 1$, we need $2n-1$ times (n次2, n次3) in total, $|R|^{2n-1}$ strings

M_{A_1} : on input " G, w "

1. convert G to CNF, $G' = (V', \bar{\Sigma}, R', S')$

2. enumerate all derivation of length at most $|R'|^{2n-1}$

3. accept if any of these derivation generates w and reject otherwise

3. $A_{PDA} = \{ \langle P, w \rangle : P \text{ is a PDA that accepts } w \}$

M_{A_2} : on input " P, w "

1. convert P into an equivalent CFG G

2. run M_{A_1} on " G, w "

3. return the result of M_{A_1}

4. $E_{CFG} = \{ \langle G \rangle : G \text{ is a CFG with } L(G) = \emptyset \}$

$S \rightarrow A$

$A \rightarrow AB$

$B \rightarrow b$

$B \rightarrow Ca$

$C \rightarrow \epsilon$

M_{A_3} : on input " G "

1. mark terminals and ϵ

2. while there is a rule with all symbols

on its right are marked but the symbol at most $|R|$ loops on the left is not marked:

mark the symbol on the left

3. if S is marked

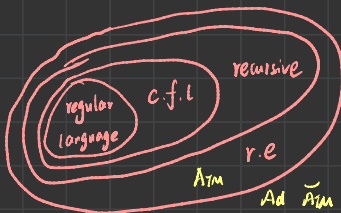
reject

4. else

accept

5. $E_{PDA} = \{ \langle P \rangle : P \text{ is a PDA with } L(P) = \emptyset \}$

transfer P into corresponding CFG



2. Countable

A set A is countable if it is finite or $\exists$ bijection $f: A \rightarrow \mathbb{N}$, uncountable otherwise

1) Lemma

A set A is countable if and only if $\exists$ injection $f: A \rightarrow \mathbb{N}$ ↗ $a \neq a', f(a) \neq f(a')$

Proof

" $\Rightarrow$ " obviously

" $\Leftarrow$ " injection: $f: A \rightarrow \mathbb{N}$, need to find bijection $g: A \rightarrow \mathbb{N}$

sort A in increasing order of $f(\cdot)$

$g(a) = \text{rank of } a$

2) Corollary

Any A' subset of a countable set is countable

Proof

$\exists$ injection $f: A \rightarrow \mathbb{N} \Rightarrow \exists$ injection $f': A' \rightarrow \mathbb{N} \Rightarrow A'$ is countable

3) Lemma

Any language is countable.

Proof

Let Σ be an alphabet, we only need to prove Σ^* is countable

Assume $\Sigma = \{0, 1\}$ $\Sigma^* = \{\epsilon, 0, 1, 00, 01, 10, 11, 000, \dots\}$

map to their ranks $\begin{matrix} & \downarrow & \downarrow & \downarrow & \downarrow & \downarrow & \dots \\ & 1 & 2 & 3 & 4 & 5 & \dots \end{matrix}$

4) Corollary

$\{M : M \text{ is a TM}\}$ is countable.

Proof

encode: $\{M\} \mapsto \{M \text{ is a TM}\}$. The corresponding language is countable.

so the original statement is true.

↘ $\exists$ language is not recursively enumerable

5) Lemma

Let Σ be a non-empty alphabet

Let $\mathcal{L}$ be the set of languages over Σ

$\mathcal{L}$ is uncountable.

Proof

Diagonalization

Suppose that $\mathcal{L}$ is countable. $L_1, L_2, L_3, \dots$

Since Σ^* is countable, the strings in Σ^* can be labeled as

$s_1, s_2, s_3, \dots$

$D = \{s_i : s_i \notin L_i\}$

for $i=1, 2, 3, \dots$

if $s_i \notin L_i$

add s_i to D

$s_i \in D$ if and only if $s_i \notin L_i \forall i \Rightarrow D \neq L_i, \forall i$

But $D \in \mathcal{L}$, Contradictory!

existing a table

	s_1	s_2	s_3	s_4	$\dots$
L_1	1	0	0	1	
L_2	1	0	1	0	
L_3	1	1	0	1	
L_4	0	1	1	0	
D	0	1	1	1	

元素 $s_i \in L_i$

取对角线, 若 L_i 中有 s_i , 则 s_i 不在 D 中. 否则在
这样的 D 不与前面所有 L_i 相同. 则不可数.

3. $A_{TM} = \{ \langle M, w \rangle : M \text{ is a TM that accepts } w \}$

Theorem:

A_{TM} is recursive enumerable

Proof: $\rightarrow$ universal turing machine

$U =$ on input $\langle M, w \rangle$

1. run M on w

2. accept $\langle M, w \rangle$ if M accepts w
reject if M rejects w

U accepts $\langle M, w \rangle$ if and only if M accepts w
if and only if $\langle M, w \rangle \in A_{TM}$

Theorem

A_{TM} is not recursive.

Proof

$A_d = \{ \langle M \rangle : M \text{ is a TM that does not accept } \langle M \rangle \}$

① if A_{TM} is recursive, A_d is recursive. $\Rightarrow A_{TM}$ is not recursive.

② A_d is not recursively enumerable.

① if A_{TM} is recursive $\Rightarrow \exists M_1$ decides A_{TM}

$M^* =$ on input $\langle M \rangle$

1. run M_1 to check whether M accepts $\langle M \rangle$

2. If M accepts $\langle M \rangle$
reject

3. else // M rejects $\langle M \rangle$ or looping on $\langle M \rangle$
accept

M^* decides $A_d \Rightarrow A_d$ is recursive

② A_d is not recursively enumerable

Suppose that A_d is r.e. $\Rightarrow \exists$ TM D semidecides A_d

D on input $\langle M \rangle = \begin{cases} \text{accept} & \text{if } \langle M \rangle \in A_d \text{ (} M \text{ rejects } \langle M \rangle \text{ or looping on } \langle M \rangle \text{)} \\ \text{reject or looping} & \text{if } \langle M \rangle \notin A_d \text{ (} M \text{ accepts } \langle M \rangle \text{)} \end{cases}$

D on input $\langle D \rangle = \begin{cases} \text{accept} & \text{if } D \text{ rejects } \langle D \rangle \text{ or looping on } \langle D \rangle \\ \text{reject or looping} & \text{if } D \text{ accepts } \langle D \rangle \end{cases}$

contradictory! $\Rightarrow A_{TM}$ 也不可判定

Theorem

If L and $\bar{L}$ is enumerable recursive, then L is recursive.

Proof

$\exists M$ semidecides L , $\exists M'$ semidecides $\bar{L}$

M^* = on input w ,

1. run M and M' on w in parallel
2. if M accepts w
accept w
3. if M' accepts w
reject w

A_{TM} is not recursive

but is recursively enumerable

$\Rightarrow \bar{A}_{TM}$ is not recursively enumerable

Week 9

1. $H_{TM} = \{ \langle M, w \rangle : M \text{ is a TM that halts on } w \}$

$A_{TM} = \{ \langle M, w \rangle : M \text{ is a TM that accepts } w \} \rightarrow \text{not recursive}$

1/3 约 A_{TM}
" M, w "

H_{TM}
 M^* = on input x
1. run M on x
2. if M accepts x
 M^* accepts x
3. if M rejects x
 M^* looping

4. if M is looping
 M^* is looping

$\rightarrow$ 可以不写

M accepts w if and only if
 M^* halts on w

Suppose that H_{TM} is recursive. $\exists M_H$ decides H_{TM} .

M_H = on input " M, w " $\rightarrow$ 相当于 input

1. construct M^* using M

- M^* = on input x
1. run M on x
 2. if M accepts x
 M^* accepts x
 3. if M rejects x
 M^* looping
 4. if M is looping
 M^* is looping

2. run M_H on " M, w "

3. if M_H accepts " M, w ".
(then we know M accepts w)
accept " M, w "

4. else M_H reject " M, w "
reject " M, w "

M_H decides A_{TM} . 矛盾.

$\rightarrow L = \text{the set of all r.e language containing } e$

2. $L_1 = \{ \langle M \rangle : M \text{ is a TM that accepts } e \}$ 不可判定.

ATM
 $\langle M \rangle w$

L_1
 M^*

We need M accepts w if and only if M^* accepts e

$M^* =$ on input x

1. run M on w

3. if M rejects w
reject x

2. if M accepts w
accepts x

归约. 一种映射

if M accepts w , then M^* accepts all inputs, including e

if M rejects or loops on w , then M^* doesn't accept any input

Suppose that L_1 is recursive, $\exists M_1$ decides L_1

$M_A =$ on input $\langle M \rangle w$:

→ 1. construct M^* using $\langle M \rangle w$

2. run M_1 on M^*

3. if M_1 rejects M^*
accepts $\langle M \rangle w$

4. if M_1 accepts M^*
reject $\langle M \rangle w$

M_A decides ATM, wrong

3. $L_2 = \{ \langle M \rangle : M \text{ is a TM that accepts all strings} \}$ 不可判定

ATM
 $\langle M \rangle w$

L_2
 $\langle M^* \rangle$

M accepts w if and only if M^* accepts all the strings.

之后与上一点类似.

4. $L_3 = \{ \langle M_1 \rangle \langle M_2 \rangle : M_1 \text{ and } M_2 \text{ are the TMs that accept the same set of strings} \}$

Suppose L_3 is recursive. $\exists M_3$ decides L_3

use M_3 to construct M_2 decides L_2

$M_2 =$ on input $\langle M \rangle$

1. construct M_E as follows

$M_E =$ on input x

1. accept

2. run M_3 on " M " " M_E " // check whether M and M_E accepts the same set of inputs
3. if M_3 accepts " M " " M_E "
accept " M "
4. if M_3 rejects " M " " M_E "
reject " M "

We know M_2 decides L_2 , so contradicting. 不可判定

5. $E_1 = \{ \langle M \rangle : M \text{ is a TM with } L(M) \text{ is regular} \}$

ATM

" M " " w "

M^* = on input x

1. run M on w
2. if M accepts w
3. run U on x
4. accepts x if U accepts x
5. rejects x if U rejects x
6. if M reject w
7. reject x

E_1

" M^* "

universal TM

U semidecides ATM
 $L(U) = ATM$

U = on input " M " " w "

1. run M on w
2. if M accepts w
 U accepts " M " " w "
3. else
 U rejects " M " " w "

M does not accept w , $L(M^*) = \emptyset$ regular / context-free
 M accepts w , $L(M^*) = ATM$ not regular / recursive
not context-free / not recursive

$E_2 = \{ \langle M \rangle : M \text{ is a TM with } L(M) \text{ is context-free} \}$

$E_3 = \{ \langle M \rangle : M \text{ is a TM with } L(M) \text{ is recursive} \}$

都有共同形式: Given a TM M , is $L(M) \in \mathcal{L}$?

$\mathcal{L}$ is a proper, non-empty subset of the class of recursive enumerable language

6. $R = \{ \langle M \rangle : M \text{ is a TM with } L(M) \in \mathcal{L} \}$ Rice's Theorem

Proof: Assume $\phi \notin \mathcal{L}$ (if $\phi \in \mathcal{L}$, $\mathcal{L} = \bar{\mathcal{L}}$)

Let $A \in \mathcal{L}$, $\exists M_A$ semidecides A

ATM

" M " " w "

R

" M^* "

M^* = on input x

1. run M on w
2. if M accepts w

3. run M_A on x
4. if M_A accepts x
5. accept x
6. if M_A rejects x
7. reject x
8. if M rejects w
9. reject x

$L(M^*) \begin{cases} \text{if } M \text{ does not accept } w, L(M^*) = \emptyset \notin \Sigma^* \\ \text{if } M \text{ accepts } w, L(M^*) = L(M_A) = A \in \Sigma^* \end{cases}$
 如果可判定 R , 那也可以判定 A_{TM} , 但 A_{TM} 不可判定。
 矛盾。

Week 10

1. Given a TM M , does $L(M)$ have property P ?

↗ equiv $L(P)$ = the set of all r.e language satisfying P

Given a TM M , is $L(M) \in L(P)$? ↗ if non-empty, proper subset then undecidable

DFA		PDA		TM	
A_{DFA}	} decidable	A_{PDA}	} decidable	A_{TM}	} undecidable
E_{DFA}		E_{PDA}		E_{TM}	
E_{DFA}		A_{LPDA}	undecidable	E_{TM}	
A_{LPDA}				H_{TM}	
				A_{LTM}	

$A_{LPDA} = \{ \langle P \rangle : P \text{ is a PDA with } L(P) = \Sigma^* \}$ is not recursive

$\Downarrow$

$NOT A_{LPDA} = \{ \langle P \rangle : P \text{ is a PDA with } L(P) \neq \Sigma^* \}$ is not recursive

H_{TM}
" M " " w "

$NOT A_{LPDA}$
" P "

We want M halts on w if and only if $L(P) \neq \Sigma^*$

$\Downarrow$

$(s, \Delta uw) \vdash_M \dots \vdash_M (h, \Delta u \Delta v)$

等价地表示成: $\Delta u s w \vdash_M \vdash_M \Delta u a h v \rightarrow$ state 放在读写头之前

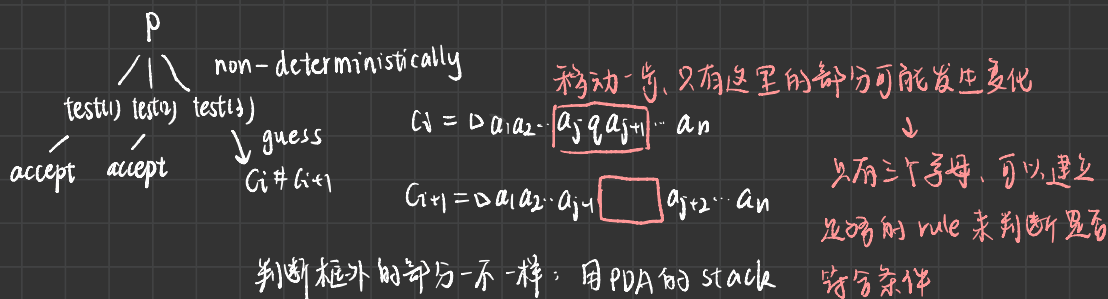
即 $\Delta u s w \# \dots \# \dots \# \Delta u a h v$ 于是构造出 δ - γ string

↪ computing history of M that halts on w

P accepts all the strings that are not computing history of M that halts on w .

$C_1 \# C_2 \dots \# C_k$ C_i is a configuration

- (1) C_i is not in the form of $\square u s w$
- (2) C_k is not in the form of $\square u a h v$
- (3) $\exists i, C_i \neq C_{i+1}$



细节: 考虑入栈和出栈顺序, 我们可以将偶数次的串反转

$$\text{即 } C_k' = C_k^R$$

IF NOTALL PDA is recursive, then Hzm is recursive. Contradiction

2. Reduction

Let A and B be two languages over Σ . A reduction from A to B is a computable function $f: \Sigma^* \rightarrow \Sigma^*$, such that for any $x \in \Sigma^*$

$x \in A$ if and only if $f(x) \in B$

Lemma

Suppose that $\exists$ reduction from A to B

$$A \leq B$$

- (1) if B is recursive, so is A .

B is recursive $\Rightarrow \exists M_B$ decides B

$\exists f: \Sigma \rightarrow \Sigma^*$ such that

$x \in A$ if and only if $f(x) \in B$

$M_A =$ on input x

1. compute $f(x)$
2. run M_B on $f(x)$
3. return the result of B

(2) if A is not recursive, nor is B

Week 10

1. a TM M prints "M" on its tape

A $\rightarrow$ B

"B" "A"

A: write "B" to the tape

B: write "A" to the tape and swap it with "B"

function $q: \Sigma^* \rightarrow \Sigma^*$ such that $q(w) = "Mw"$

Given any string w

1. construct Mw

2. return "Mw"

$\downarrow$ Mw = on any input

1. print w on the tape

B = on input w

1. compute $q(w)$

2. write it to the tape and swap it with w

A = on any input

1. write "B" to the tape

"B" "A"

get "A" "B"

2. Recursive Theorem

For any TM T, there is a TM R such that for any string w, the computation of T on "R" w is equivalent to that R on w.

T = on input "M" w
do something

R = on input w
1. run T on "R" w

允许如下代码:

M = on input x

1. obtain its own coding "M"

legal

T

R

A $\rightarrow$ B $\rightarrow$ T

w "B" "T" "A"

A writes "B" "T"

"A" "B" "T" w

B writes "A" and reorder the content of tape

3. $L(R) = \{ "R" \}$

R = on input x

1. obtain its own coding " R "
2. if " R " = x
3. accept
4. else
5. reject

T = on input " M " x

1. if " M " = x
2. accept
3. else
4. reject

4. ATM is not recursive.

$\exists$ TM M_A decides ATM

M^* = on input x

1. obtain " M^* "
2. run M_A on " M^* " x
3. if M_A accepts " M^* " x
4. rejects x
5. else
6. accepts x

M_A 的判断总是错误的, 因此不存在这样的
那么 ATM 不可判定

5. 哥德尔不完备性定理:

a statement x

a proof z

$$V(x, z) = \begin{cases} 1 & \text{if } z \text{ is a valid for } x \\ 0 & \text{otherwise} \end{cases}$$

let $\mathcal{L}$ be a language (the set of true statements)

A proof system for $\mathcal{L}$ is a TM V such that:

1) effectiveness, for $x, y \in \Sigma^*$, V either accepts or rejects (x, y)

2) soundness, for $x \notin \mathcal{L}$, $V(x, y) = 0$ for all y

$\rightarrow$ provable

V is complete if for any $x \in \mathcal{L}$, there is some y such that $V(x, y) = 1$

Theorem:

Some language $\mathcal{L}$ does not have a complete proof system.

Lemma:

A has a complete proof system if and only if A is recursively enumerable.

$\Rightarrow \exists$ complete proof system V

M = on input x

1. for $y \in \Sigma^*$ in increasing order of length
2. if $V(x, y) = 1$
3. accept x

$\Leftarrow \exists M$ semidecides A

$V = \text{on input } (x, y)$

1. run M on x for y steps

2. accepts (x, y) if M accepts x within y steps

① - 一定会停机, 满足 effectiveness ② $x \notin A$, 对 $\forall y$, x 都不会被接受, 满足 soundness

③ complete 显然满足

So $\bar{A}_M$ has no complete proof system

a proof system V for $\bar{A}_M$

$R = \text{on input } x$

1. obtain " R "

2. for $y \in \mathbb{N}$ in increasing order of length

3. if $V(R, x, y) = 1$

4. halt and accept x

If V is complete

$R \text{ accepts } x \Leftrightarrow \exists y. \text{ s.t. } V(R, x, y) = 1 \Leftrightarrow R, x \in \bar{A}_M$

6. Enumerator

We say a TM M enumerates a language L if for some state q

$L = \{w : (s, w) \in T_M^*(q, w)\}$
 $\hookrightarrow$ Turing enumerable $\xrightarrow{\text{output } w}$ output state

Theorem:

A is Turing enumerable if and only if A is recursively enumerable.

Proof:

Assume that A is a infinite set

$\Rightarrow$ Obvious

$\Leftarrow \exists M$ semidecides A

for $s \in \Sigma^*$ in increasing order of length

run M on s

if M accepts s ,

accept s

$\rightarrow$ 可能会出现 looping

for $i = 1, 2, 3, 4, \dots$

for $j = 1 \dots i$

run M on s_j for i steps

if M accepts s_j

output s_j

7. A TM M is minimal if $|'N'| < |'M'|$ implies $L(N) \neq L(M)$

$$MIN_{TM} = \{ 'M' : M \text{ is a minimal TM} \}$$

$R =$ on input x

1. obtain $'R'$
2. enumerate MIN_{TM} until obtain $'B'$ with $|'B'| \neq |'R'|$
3. run B on x

We know $L(R) = L(B)$, but $|'R'| < |'B'|$, contradicting with B is minimal.

So we can't enumerate MIN_{TM} , is not r.e.

Week 11

1. Let M be a standard DTM that halts on every input

The running time of M is a function $f: N \rightarrow N$
input length $\searrow$ # steps

On any input of length n , M halts within $f(n)$ steps.

2. $DTIME(t(n)) = \{ L : L \text{ can be decided by some standard DTM within running time } O(t(n)) \}$

① $\{0^k 1^k, k \geq 0\}$: 1. 扫第一遍, 确定长度

2. 之后每次, 对序列喊1, 每隔一个删一个.

3. 看0和1是否同时删完

$DTIME(n \log n)$

if use two-tape, we only need $O(n)$ steps

1) 一个 tape 0 2) 一个 tape 1

② If k -tape TM in $t(n)$ time, then for single tape

one step $\rightarrow O(t(n))$ steps (at most $2t(n)$ steps)

$t(n)$ step $\rightarrow O(t(n))$ steps

3. The Cobham-Edmond Thesis

Any "reasonable" and "general" deterministic model of computation is polynomially related.

4. $P = \{ L : L \text{ can be decided by some standard DTM with } \text{poly}(n) \text{ running time} \}$

$$P = \bigcup_{k \geq 0} DTIME(n^k)$$

5. Theorem

Every context-free language is in P .

Proof: chomsky norm form

$$\begin{cases} S \rightarrow e \\ A \rightarrow BC \\ A \rightarrow a \end{cases}$$

$$|R|^{2n-1}$$

Dynamic Programming

$$a_1 a_2 \dots a_n \quad S \Rightarrow^* a_1 a_2 \dots a_n$$

subproblems

for $1 \leq i \leq j \leq n$ define

$$T[i][j] = \{ A \in V - \Sigma : A \Rightarrow^* a_i a_{i+1} \dots a_j \}$$

Goal: $T[1][n]$

Base case: for $1 \leq i \leq n$, $T[i][i] = \{ A \in V - \Sigma : A \Rightarrow a_i \}$

Recurrence

for $1 \leq i \leq j \leq n$

$$T[i][j] = \bigcup_{k=i}^{j-1} \{ A : A \Rightarrow BC, B \in T[i][k] \wedge C \in T[k+1][j] \}$$

$$a_i \dots a_k \quad a_{k+1} \dots a_j$$

$A \Rightarrow BC$

subproblems: n^2

cost per subproblem: $n \cdot |R| \cdot (|V| - |\Sigma|)^2$

total: $n^3 \cdot |R| \cdot (|V| - |\Sigma|)^2 \quad O(n^3)$

判断 B, C 是否存在对应集合

6. SAT (satisfiability) Problem

Let $X = \{x_1, \dots, x_n\}$ be a set of boolean variable

$x_1, \dots, x_n, \bar{x}_1, \dots, \bar{x}_n$: literals

a clause is like $x_1 \vee x_2 \vee \bar{x}_3 \vee \bar{x}_4 \vee x_5$

a boolean formula is like $(x_1 \vee x_2 \vee \bar{x}_3) \wedge (x_3 \vee x_4) \wedge (x_1 \vee \bar{x}_4 \vee x_5)$

A truth assignment of X is $T: X \rightarrow \{0, 1\}$

T satisfies F if F is true under T .

SAT: given a boolean formula F , is F satisfiable?

$\{ "F": F \text{ is a satisfiable boolean formula} \}$

SAT $\in P$? unknown

7. Let M be a NTM. The running time of M is a function $f: N \rightarrow N$.

For any input of length n , every branch of M halts within $f(n)$ steps.

M on input F

1. non-deterministically generate a truth assignment T

2. if T satisfies F

3. accept

4. else

5. reject

8. $NP = \{L : L \text{ can be decided by some NTM within } \text{poly}(n) \text{ running time}\}$
 $P \subseteq NP$ $P = NP?$ unknown $P \neq NP$ is widely believed

9. Theorem

$P = NP$ if and only if $SAT \in P$

10. language A , ^{polynomial-time verifiable} DTM V 满足这三个条件的证明系统不为存在
 (1) for any $x \in \Sigma^*$, any $y \in \Sigma^*$ 但对部分 A 成立

$V(x, y) = \begin{cases} \text{accept} \\ \text{reject} \end{cases}$ effectiveness

and V has polynomial running time

(2) for any $x \notin A$, $V(x, y) = \text{reject}$ for any $y \in \Sigma^*$ soundness

(3) for any $x \in A$, $\exists y \in \Sigma^*$, $V(x, y) = \text{accept}$ completeness
 with $|y| \leq \text{poly}(|x|)$

11. SAT is polynomial-time verifiable.

$V =$ on input F and T

1. evaluate F using T
2. if T satisfies F
3. accept
4. else
5. reject

12. Theorem:

L is polynomial-time verifiable $\iff L \in NP$

Proof:

$\Rightarrow \exists V$ -----

$M =$ on input x (decide $x \in L$ in $\text{poly}(|x|)$ time)

1. non-deterministically generate a proof y with $|y| \leq \text{poly}(|x|)$
2. run V on x and y
3. if V accepts x and y
4. accept x
5. else
6. reject

$\Leftarrow \exists$ NTM M decides L in $\text{poly}(n)$ time



$V =$ on input x and y

1. run M on x following y deterministically
2. if M accepts x
3. accept x and y
4. else

可以验证 V 符合要求

5. reject x and y

Week 13

1. Theorem: $\text{SAT} \in P$ if and only if $P = NP \Leftrightarrow \text{SAT}$ is NP-complete

2. Polynomial time reduction

computable $\Leftarrow f: \Sigma^* \rightarrow \Sigma^*$ s.t. $x \in A \iff f(x) \in B$

① Given x , $f(x)$ can be computed in $\text{poly}(|x|)$ time

记作 $A \leq_p B$

(1) Lemma: If $A \leq_p B$ and $B \in P$, then $A \in P$

Proof: $x \in A \rightarrow f(x) \rightarrow f(x) \in B$?

time: $\text{poly}(|x|)$ $\text{poly}(|f(x)|)$ time
 $|f(x)| = \text{poly}(|x|)$ $\downarrow$
 $\text{poly}(|f(x)|) = \text{poly}(\text{poly}(|x|)) = \text{poly}(|x|)$

□

(2) A is NP-complete if ① $A \in NP$ ② $\forall B \in NP, B \leq_p A$

3. Cook-Levin Theorem: SAT is NP-complete.

$x \mapsto F$ $\leftarrow$ boolean formula

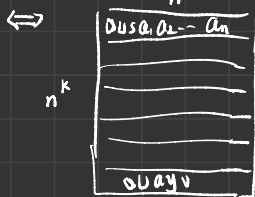
Proof: Let $B \in NP$, then we need to prove $B \leq_p \text{SAT}$ $x \in B \iff F$ is satisfiable

Cause $B \in NP$, $\exists \text{TM } N$ decides B in $\text{poly}(n)$ time

$a_1 a_2 \dots a_n \in B \Leftrightarrow (s, \exists u, a_1 \dots a_n) \vdash_N \dots \vdash_N (y, u, u, v)$

$\leq n^k$ configurations of length n^k

$\Leftrightarrow \exists u, a_1 a_2 \dots a_n \vdash_N \dots \vdash_N u, u, v \Leftrightarrow F = (x_1 \vee x_2 \vee x_3) \wedge (\dots) \wedge (\dots)$



每行对应一个 configuration

for $1 \leq i \leq n^k, 1 \leq j \leq n^k, c \in \Sigma$

$x_{ijc} \rightarrow$ 第 i 行第 j 列是 c

① every cell contains a character $c \in \Sigma$

$$\sum_{c \in \Sigma} x_{ijc} = 1$$

$$\bigwedge_{\substack{c, c' \in \Sigma \\ c \neq c'}} \overline{x_{ijc}} \wedge \overline{x_{ijc'}}$$

$$\Leftrightarrow \begin{cases} \sum_{c \in \Sigma} x_{ijc} \geq 1 \\ \sum_{c \in \Sigma} x_{ijc} \leq 1 \end{cases}$$

② first row contains initial configurations

$$x_{110} \wedge x_{120} \wedge x_{130} \wedge x_{140} \wedge \dots \wedge$$

③ some cell contains y

$$\sum_j x_{ijy} \geq 1 \Leftrightarrow \forall_j x_{ijy}$$

④ $i = 1, \dots, n^k, b_1, b_2, \dots, b_{k-1}, b_k, b_{k+1}, \dots, b_{k+(2+2)}$

$$i = 1, \dots, n^k, b_1, b_2, \dots, b_{k-1}, b_k, b_{k+1}, \dots, b_{k+(2+2)}$$

$$\begin{pmatrix} b_1 & b_{k+1} & b_k \\ b_i & b_{i+1} & b_{i+2} \end{pmatrix}$$

$$\begin{pmatrix} x_{ij} \\ x_{i+1j} \end{pmatrix} \quad (\vee_{c \in \Sigma} (x_{ijc} \wedge x_{i+1jc})) \wedge (j+1) \wedge (j+2)$$

$$\begin{pmatrix} b_{k+2} & b_{k+1} & b_k \\ b_{k+2} & b_{k+1} & ? \end{pmatrix}$$

q

$$(\dots) \wedge (\dots) \wedge (x_{ijc} \vee x_{i+1jc} \vee \dots)$$

↓ 符合 rule, 如 (q, b_k, p, c) , 则? 可能是 c

b_{k-1}	b_k	q
b_{k-1}	?	?

b_{k-1}	q	b_k
?	?	?

... 类似

因此, 存在上述的 table 可以用一个 bool 函数表示
同时我们验证的过程也是多项式时间的
这样我们就完成了证明

4. Lemma: Let A be a NP-complete. Let B be language. If

(1) $B \in NP$ (2) $A \leq_p B$

then B is NP-complete.

Proof: If $C \leq_p A$ and $A \leq_p B$, then $C \leq_p B$

$\Rightarrow \forall C \in NP, C \leq_p A + (2)$

$\Rightarrow \forall C \in NP, C \leq_p B + (1)$

$\Rightarrow B$ is NP-complete $\square$

5. 3SAT: $(x_1 \vee x_2 \vee \bar{x}_3) \wedge (\dots \vee \dots \vee \dots) \wedge (\dots \vee \dots \vee \dots) \dots$

each clause has three literals 不能重复

① 3SAT $\in NP$, simple.

② $SAT \leq_p 3SAT$

SAT

3SAT

$() \wedge () \wedge () \rightarrow (\vee \vee) \wedge \dots \wedge (\vee \vee)$

$x_1 \rightarrow (x_1 \vee y) \wedge (x_1 \vee \bar{y})$

$\rightarrow$ 12倍长度 常数

$x_1 \vee x_2 \rightarrow (x_1 \vee x_2 \vee y) \wedge (x_1 \vee x_2 \vee \bar{y})$

$x_1 \vee x_2 \vee x_3 \vee x_4 \vee x_5 \rightarrow (x_1 \vee x_2 \vee y) \wedge (\bar{y} \vee x_3 \vee x_4 \vee x_5)$

k 项 $\rightarrow$ k-3 次, 生成 $k-2$ 个 $()$, 即 $k-2$ 项, 多项式

$\square$

b. Clique

$G=(V, E)$

团: 顶点, 两两之间都有边



$\{b, c, d\} \vee$

$\{a, b, c\} \times$

Clique = $\{ "G" "k" : G \text{ has a clique with at least } k \text{ nodes} \}$

① Clique $\in NP$ 略

② $3SAT \leq_p \text{Clique}$

3SAT

Clique

$(x_1 \vee x_2 \vee \bar{x}_3) \wedge (\dots \vee \dots \vee \dots) \wedge ()$

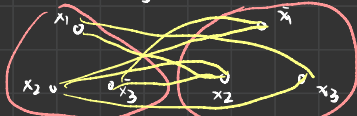
G, k

m clauses

m groups of nodes

$3m \text{ nodes} \leq 9m^2 \text{ edges}$

$(x_1 \vee x_2 \vee \bar{x}_3) \wedge (\bar{x}_1 \vee x_2 \vee x_3)$



我们只在不同组之间连边, 连接所有不冲突的边,

冲突: x_1 与 $\bar{x}_1$ 这种情况

F is satisfiable $\iff G$ has a clique at least m nodes

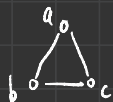
$\hookrightarrow$ 至少存在 m 个互不冲突的点 $\rightarrow m$ 个点的团

可满足 $\leftarrow$ 直接让这 m 个点对应变量为真 $\leftarrow$

7. Vertex Cover

$G = (V, E)$

一组点, 使得所有边至少有一个顶点在其中



$\{a, b\} \checkmark$

$\{a\} \times$

$VC = \{ "G" "k" : G \text{ has a vertex cover with at most } k \text{ nodes} \}$

① $VC \in NP$

② $3SAT \leq_p VC$

3SAT

VC

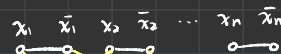
$G \quad k$

$F = () \wedge () \wedge ()$

n variables

m clauses

① $2n$ nodes



② $3m$ nodes



... m groups

③ 在不同颜色的同名顶点连一条边

覆盖白边和红边, 至少需要 $n+2m$ nodes

可以证明: F is satisfiable $\iff G$ has a vertex cover with at most $k = n+2m$ nodes

$\hookrightarrow$ 每个 group, 变量为真选白点, 为假选红点

Week 14

1. Let M be a standard DTM. M runs in $f(n)$ space if for any input of length n , M uses at most $f(n)$ tape cells.

(1) $PSPACE = \{ A : A \text{ can be decided by some DTM that runs in } poly(n) \text{ space} \}$

DTM

time

$f(n)$

$\Rightarrow$

space

$O(f(n))$

$(q, D, \dots)$ configuration

$\downarrow$
 $|K| \cdot f(n) \cdot |Z|^{f(n)} = 2^{O(f(n))}$

$2^{O(f(n))}$

$\Leftarrow$

$f(n)$

always halt

读写头位置

由于保证停机
因此遍历过程不会出重复的 configuration

So, $P \subseteq PSPACE \subseteq EXP$

$EXP = \{ A : A \text{ can be decided by some DTM within } 2^{poly(n)} \text{ time} \}$

2. Let N be a standard NTM, N runs in $f(n)$ space if for any input of length n , every branch uses at most $f(n)$ tape cells.

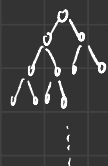
$\text{NPSPACE} = \{A : A \text{ can be decided by some NTM in } \text{poly}(n) \text{ space}\}$

$\text{NP} \subseteq \text{NPSPACE}$

$\text{PSPACE} \subseteq \text{NPSPACE}$

(1) $\text{NP} \subseteq \text{PSPACE}$

$A \in \text{NP} \Rightarrow \exists \text{ NTM decides } A \text{ in } \text{poly}(n) \text{ time}$



$\text{poly}(n)$

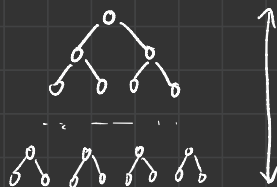
$\rightarrow$ 分支数量是有限的

$\Rightarrow \exists \text{ DTM } M. \text{poly}(n) + \text{poly}(n) = \text{poly}(n)$

(2) $\text{PSPACE} = \text{NPSPACE}$

$A \in \text{NPSPACE}$

$\Rightarrow \exists \text{ NTM } N \text{ decides } A \text{ in } \text{poly}(n) \text{ space}$



$2^{\text{poly}(n)}$ time
 $\text{poly}(n)$ space

DTM 模拟 NTM 还需要存每次的选择

$\Rightarrow \text{DTM } M \text{ decides } A \text{ in } \text{poly}(n) \text{ space}$

N has $2^{\text{poly}(n)}$ distinct configurations

accept: $\exists C_{\text{initial}} \longrightarrow C_{\text{accept}}$ in $2^{\text{poly}(n)}$ time and $\text{poly}(n)$ space

$\Leftrightarrow \exists c', C_{\text{initial}} \rightarrow c'$ in $2^{\text{poly}(n)-1}$ time and $\text{poly}(n)$ space

$c' \rightarrow C_{\text{accept}}$ in $2^{\text{poly}(n)-1}$ time and $\text{poly}(n)$ space

$M = \text{on input } c_1, c_2, t \quad (N \quad c_1 \rightarrow c_2 \text{ in time } t)$

1. if $t=1$
2. if $c_1=c_2$ or $c_1 \vdash_N c_2$
3. accept
4. else
5. reject
6. for each c' using at most $\text{poly}(n)$ space
7. run M on $c_1, c', t/2$
8. run M on $c', c_2, t/2$

9. if both accepts
10. accept
11. reject

$S(t)$ represents the space with input t .

$$\begin{aligned} S(1) &= \text{poly}(n) \\ S(t) &= S(t/2) + \text{poly}(n) \end{aligned} \Rightarrow S(t) = \text{poly}(n) \cdot \log t$$

空间 $\leftarrow$ 可以复用

run M on C_{initial} , C_{accept} , $2^{\text{poly}(n)}$

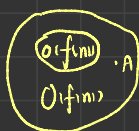
$$\Rightarrow \text{poly}(n) \cdot \text{poly}(n) = \text{poly}(n) \quad \square$$

- (3) $P \subseteq NP \subseteq \text{PSPACE} \subseteq \text{EXP}$ We can prove $P \neq \text{EXP}$
- NPSPACE

3. Hierarchy Theorem

$f(n)$ can be computed in $O(f(n))$ space

- (1) Space: for any $f: \mathbb{N} \rightarrow \mathbb{N}$ satisfying certain technical conditions there is a language A such that



- (1) A can be decided by some DTM in $O(f(n))$ space
- (2) A cannot be decided by any DTM in $o(f(n))$ space

construct DTM D

- (1) D decides some language A in $O(f(n))$ space.
- (2) for any DTM M that runs in $o(f(n))$ space, D and M differ on at least one input.

	" M_1 "	" M_2 "	" M_3 "
M_1	+		
M_2		-	
M_3			0
$\vdots$			
D	-	+	+/-

$o(f(n)) + 1$

$D =$ on input " M "

1. let $n = |M|$

2. compute $f(n)$

3. run M on " M "

4. If M accepts " M " within $c^{f(n)}$ steps and $o(f(n))$ cells

5. reject

6. else

7. accept

D runs in $O(f(n))$ space and D decides some language.

And we easily know D satisfies (2)

- (2) Time: For any $f: \mathbb{N} \rightarrow \mathbb{N}$ satisfying $f(n)$ can be computed in $O(f(n))$ time there is a language A :

(1) A can be decided by some DTM in $O(f(n))$ time

(2) A cannot be decided by any DTM in $O(\frac{f(n)}{\log f(n)})$ time

D = on input 'M'

1. let $n = |M|$
2. compute $f(n)$
3. run M on "M" for $\frac{f(n)}{\log f(n)}$ steps → 需要时间更新 counter
4. If M accepts "M" within $f(n)/\log f(n)$ steps
5. reject
6. else
7. accept

Week 15

1. $F(x) = \prod_{i=1}^d (x - c_i)$ $G(x) = \sum_{i=0}^d c_i x^i$

We need to judge whether $G(x) = F(x)$

直接比: $O(\sum_{i=1}^d i) = O(d^2)$

随机, sample $r \in \{1, \dots, 100d\}$

if $F(r) = G(r)$

yes

$O(d)$ time

else

no

"Fail" if and only if $F(x) \neq G(x)$ but $F(r) = G(r)$

$\Pr[F(r) = G(r) \mid F(x) \neq G(x)]$ define $H(x) = F(x) - G(x)$

$= \Pr[H(r) = 0 \mid H(x) = \sum_{i=0}^d c_i' x^i \text{ and } \exists c_i' \neq 0]$

$\leq \frac{1}{100}$ ($H(x)$ 至多 d 个根)

in RP

if $F(x) = G(x)$, always correct

if $F(x) \neq G(x)$, "fail" probability $\leq \frac{1}{100}$

→ 降低错误率 } sample 数
→ 重复算法

Algorithm B:

run A for k times

if $F(x) \neq G(x)$ in some execution of A

no

else

yes

if $k = \log d$

"Fail" probability $\leq (\frac{1}{100})^k \leq \frac{1}{d}$

2. Given three $n \times n$ matrices A, B, C , whether $A \cdot B = C$

不用随机 $O(n^{2.8})$

sample $(r_1, r_2, \dots, r_n) \in \{0, 1\}^n$

If $A(B \cdot \vec{r}) = C \cdot \vec{r}$

yes

$O(n)$ time

else

no

"fail" probability

$$\Pr(A B \vec{r} = C \vec{r} \mid AB \neq C)$$

$$D = AB - C$$

$$\begin{pmatrix} d_{11} & d_{12} & \dots & d_{1n} \\ \vdots & \vdots & & \vdots \\ d_{n1} & d_{n2} & \dots & d_{nn} \end{pmatrix}$$

$$= \Pr(D \vec{r} = \vec{0} \mid D \neq \vec{0}) \quad \text{Assume } d_{11} \neq 0$$

$$\Pr(d_{11}r_1 + d_{12}r_2 + \dots + d_{1n}r_n = 0 \mid r_2, \dots, r_n) \leq \frac{1}{2}$$

deferred decisions

$$\Pr(d_{11}r_1 + d_{12}r_2 + \dots + d_{1n}r_n = 0)$$

$$= \sum_{(r_2, \dots, r_n)} \Pr(d_{11}r_1 + d_{12}r_2 + \dots + d_{1n}r_n = 0 \mid r_2, \dots, r_n) \cdot \Pr(r_2, \dots, r_n)$$

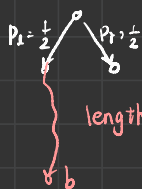
$$\leq \frac{1}{2} \cdot \sum_{(r_2, \dots, r_n)} \Pr(r_2, \dots, r_n) \leq \frac{1}{2}$$

repeat $\log n$ time $\Rightarrow$ fail probability $\rightarrow \frac{1}{n}$

3. Probabilistic Turing Machine

Non-deterministic TM

每个分支可选择的至多只有两个，并以等概率选择任何一个分支



$$\Pr[b] = 2^{-k}$$

$$\Pr[M \text{ accepts } w] = \sum_{b \text{ accepts } w} \Pr[b]$$

M decides a language A with error probability δ if

(1) for any $w \in A$, $\Pr[M \text{ accepts } w] \geq 1 - \delta$

(2) for any $w \notin A$, $\Pr[M \text{ rejects } w] \geq 1 - \delta$

BPP: the class of languages that can be decided by probabilistic polynomial-time

TM with error probability at most $\frac{1}{3} \rightarrow$ can be replaced by any $c < \frac{1}{2}$

多次 run 即可

Amplification Lemma

Let δ be a constant with $0 < \delta < 1/2$, Let M be a probability poly-time TM

with err prob δ . Then for any poly $p(n)$, there is a prob poly-time TM M' with error probability $2^{-p(n)}$

M' on input x

1. run M on x independently for $2k$ times

2. If most runs of M accepts x
accept

3. Else

reject

$2k$: w ^{wrong} c ^{correct}

$$\Pr[M' \text{ fails}] = \Pr[M' \text{ fails for } w \text{ times for } w > k]$$

$$= \sum_{w=k+1}^{2k} \Pr[M' \text{ fails for } w \text{ times}]$$

$$= \sum_{w=k+1}^{2k} C_{2k}^w \delta^w (1-\delta)^{2k-w} \quad \delta < \frac{1}{2}, w > k$$

$$\leq \delta^k (1-\delta)^k$$

$$\leq \delta^k (1-\delta)^k \cdot \sum_{w=k+1}^{2k} C_{2k}^w$$

$$\leq \delta^k (1-\delta)^k 2^{2k} \leq (4\delta(1-\delta))^k < 2^{-p(n)}$$

$$k \cdot \log 4\delta(1-\delta) < -p(n)$$

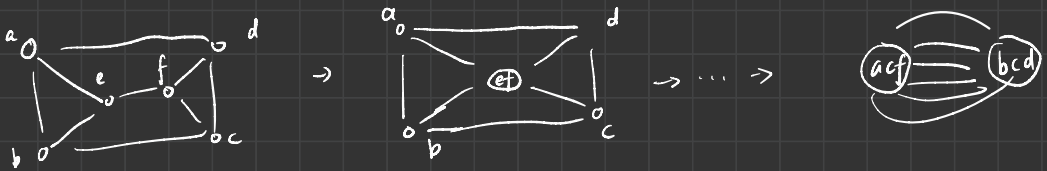
$$k > \frac{-p(n)}{\log 4\delta(1-\delta)}$$

So $P \subseteq BPP$

$P=BPP$? Unknown $\exists A \in BPP, A \notin P$? Unknown

4. Min-cut 使图不连通, 最少需要删多少边

Undirected graph, $G=(V, E)$ 假设最小割边集 C^*



合并到只剩下两个顶点, 这时剩下的边就是一个割边集 (注意到会有重边)

如果每一次合并的边都不在 C^* 中, 那么最后剩的就是 C^*

Lemma

If the min-cut of G has at least k edges, then G has at least $\frac{kn}{2}$ edges.

Proof

一个顶点连着的所有边必然构成割边集, 则由 min-cut $\geq k$, 每个点度数也大于 k

因此一共至少 $\frac{kn}{2}$ 边。

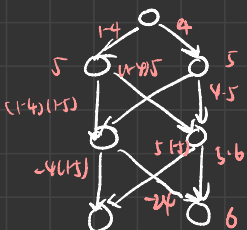


read-once branching program	B_1	B_2	$x_1 \vee x_2$	$x_1 + x_2$
boolean function	F_1	F_2	$x_1 \wedge x_2$	$x_1 x_2$
polynomial	P_1	P_2	$x_1 \wedge \overline{x_2}$	$x_1(1-x_2)$

judge two polynomial with n variables

$P_1(x_1, \dots, x_n)$ of degree d $\rightarrow$ path 长度 $P_2(x_1, \dots, x_n)$ of degree d

$$P(4, 5, 6) = 6 \quad F(4, 5, 6) = 6$$



1. randomly sample $x_1, \dots, x_n$ from field F of k elements

2. If $P_1(x_1, \dots, x_n) = P_2(x_1, \dots, x_n)$

return $B_1 \equiv B_2$

3. else

return $B_1 \neq B_2$

$\mathbb{Z}_p = \{0, 1, \dots, p-1\}$, p is a prime

$$2 + p - 1 \equiv 1 \pmod{p}$$

$$2 \times (p-1) \equiv p-2 \pmod{p}$$

$$P_1 \neq P_2 \quad P_1(x_1, x_2, \dots, x_n) = P_2(x_1, x_2, \dots, x_n)$$

$$P^* = P_1 - P_2 \quad \bar{P}^*(x_1, \dots, x_n) = 0$$

Lemma

$$\Pr[P^*(x_1, x_2, \dots, x_n) = 0] \leq \frac{nd}{p}$$

Proof

If $n=1$, trivially holds

Assume $n \leq k$, $\dots$ holds

when $n = k+1$

$$P^*(x_1, x_2, \dots, x_{k+1}) \Rightarrow P'(x_{k+1})$$

assume $n, k \uparrow$ sample $\{x_i\}$

$$P'(x_{k+1}) = p_0 + p_1 x_{k+1} + p_2 x_{k+1}^2 + \dots + p_d x_{k+1}^d$$

$$p_0, p_1, \dots, p_d \xleftarrow{\text{decide}} x_1, x_2, \dots, x_k$$

$$\text{case 1: } p_0 = p_1 = \dots = p_d = 0 \quad \Pr[\] \leq \frac{kd}{p}$$

$$\text{case 2: } \exists p_i \neq 0, \Pr[P'(x_{k+1}) = 0] \leq \frac{d}{p}$$

$$\Pr[\text{failure}] \leq \frac{kd}{p} + \frac{d}{p} = \frac{(k+1)d}{p}$$

如何等概率地 sample

□

$S = \{1, 2, \dots, m\}$ $m = 2^n$ $b_1, b_2, \dots, b_{\log m}$ 每一位可以抽硬币决定 0 或 1

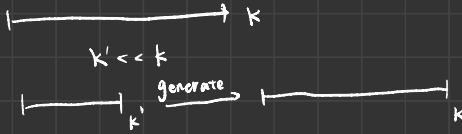
$$p > \frac{1}{2} \cdot \lceil 1 - g \rceil \quad b_1 b_2 \dots b_{\lceil \log m \rceil} \quad \Pr[i \text{ is sampled}] = \frac{p}{m} \text{ for every } i \in S$$

$D(I, r)$

random tape

If $|I| \leq \log |I|$ 枚举 n 次 去随机

$BPP = P \rightarrow$ 是否可以通过某种算法降低随机化程度



$P \quad NP \quad EXP \quad BPP$

$$P \subseteq BPP \subseteq EXP$$

Conjecture

$$P \neq NP \quad P = BPP$$

Lemma

If $P = NP$, then $BPP = P$