

— 作业题的扩展(历年卷 X)

讨论 20% . 实验 20% . 期末 60% . 作业 0%

LECOI

3. hardness complexity class → complexity theory 复杂性理论

为了研究复杂度

1. definitions of problem & computing model → automata theory

(
finite automata
pushdown automata
Turing machines)

church-Turing Thesis: 图灵机是终极计算模型

2. computability theory 可计算理论

Optimization Problem

Given a graph $G = (V, E, w)$, what is the MST?

Search Problem

..... and an integer k , find a spanning tree with weight at most k .

Decision Problem

....., is there a spanning tree with weight at most k

Counting Problem

Decision Problem

抽象为形式化的问题

... , is there a spanning tree with weight at most k

yes-instance
no-instance

这个问题是由这个 set 定义的

(

Given a string w , what encodings of yes-instances?

a language (所有判定问题可以抽象为
一个 yes-instance 的集合)

Σ

An alphabet is a finite set of symbols.

e.g. $\Sigma = \{0, 1\}$, $\{a, b, c, \dots, z\}$

$= \{\alpha, \beta, \gamma, \dots\}$

$= \{ \} \rightarrow \text{empty}$

A string over Σ is a finite sequence of symbols from Σ

e.g. $\Sigma = \{0, 1\}$ 0, 1, 00100...

length $|w| = \# \underset{\substack{\text{number of}}}{\text{symbols in } w}$ empty string : e with $|e|=0$

$\Sigma^i =$ the set of all strings of length i over Σ .

e.g. $\Sigma = \{0, 1\}$ $\Sigma^0 = \{\epsilon\}$ $\Sigma^1 = \{0, 1\}$ $\Sigma^2 = \{00, 01, 10, 11\}$

$\Sigma^* = \bigcup_{i=0}^{\infty} \Sigma^i$ $\Sigma^+ = \bigcup_{i \geq 1} \Sigma^i$

concatenation

$$e.g. u = 123, v = 456 \quad uv = 123456$$

exponentiation

$$w^i = \underbrace{w \dots w}_{i \text{ times}} \quad \stackrel{e.g.}{w} \quad w^0 = \epsilon \quad w^2 = \epsilon \mid \epsilon$$

reversal

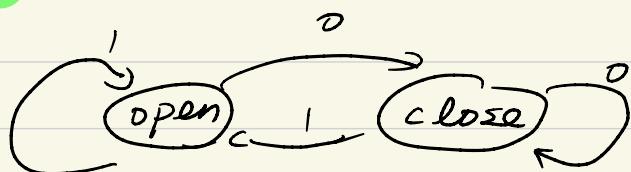
$$w = a_1 \dots a_i \quad w^R = a_i \dots a_1$$

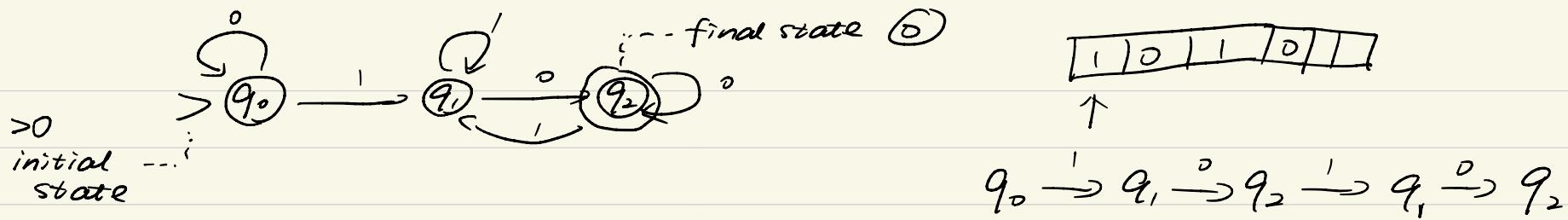
Any subset of Σ^* is a language over Σ .

decision problems \Leftrightarrow languages

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

finite automata

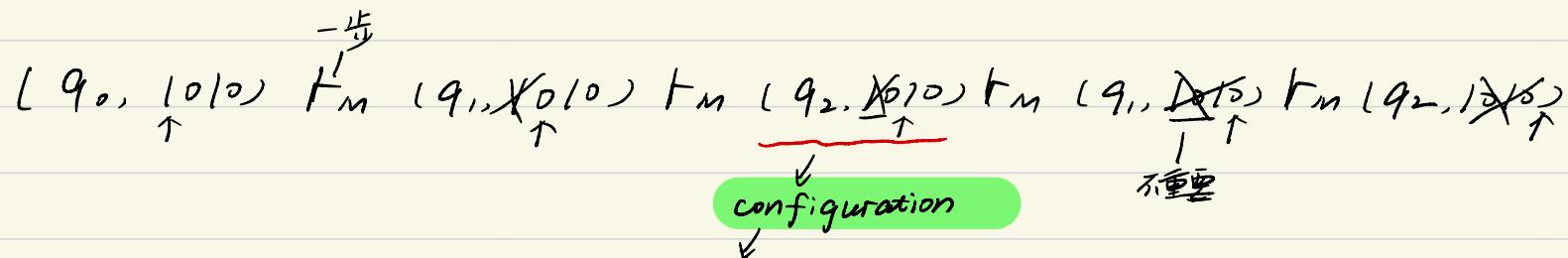




A finite automata $M = (K, \Sigma, \delta, s, F)$

- Σ : input alphabet 纸带上的字符
- K : set of state 集合
- $s \in K$: initial state 唯一
- $F \subseteq K$: the set of final states 可以为空, 可以多个
- transition functions $\delta: K \times \Sigma \rightarrow K$
 $\downarrow \text{current state}$ $\downarrow \text{symbol}$ $\downarrow \text{next state}$

e.g. $\delta(q_0, 0) = q_0$ $\delta(q_0, 1) = q_1$...



yields in one step

an element of $K \times \Sigma^*$
 $\downarrow \text{current state}$ $\downarrow \text{unread input}$

$(q, w) \xrightarrow{*} (q', w')$ if $w = aw'$ for some $a \in \Sigma$ 走一步

$\xrightarrow{*} \text{yields}$
 $\xrightarrow{*} \text{if } (q, w) = (q', w') \text{ or 走若干步}$
 $(q, w) \xrightarrow{*} \dots \xrightarrow{*} (q', w')$

M accepts $w \in \Sigma^*$ if $(s, w) \xrightarrow{t_m} (q, e)$ for some $q \in F$ 把 input 读完到 final state

$$L(M) = \{w \in \Sigma^* \mid M \text{ accepts } w\}$$

language of M (由 M 唯一确定)

M accepts $L(M)$.

含义不同

对多是 language, M accepts $L \Leftrightarrow \forall w \in L, M \text{ accepts } w$

每一台 M . accept 的 L 有且只有一个
($L(M)$ 子集也不行)

$\forall w \notin L, M \text{ does not accept } w$

Exercise



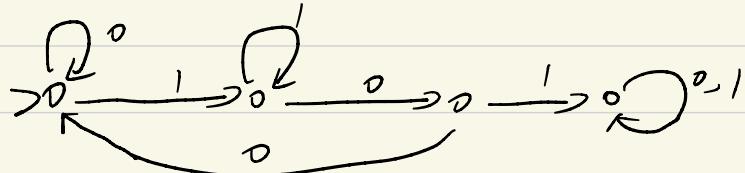
没有 final state $\Rightarrow L(M) = \emptyset$ ({ } X)



$$L(M) = \{0, 1\}^*$$

A language is regular if it is accepted by some FA.

Exercise: prove $\{w \in \{0, 1\}^* : w \text{ contains } 101 \text{ as a substring}\}$



Regular Operations

封闭的. 操作后仍是 regular

Union. $A \cup B = \{w : w \in A \text{ or } w \in B\}$

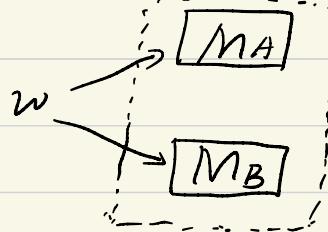
Concatenation $A \cdot B = \{ab : a \in A \text{ and } b \in B\}$ e.g. $A = \{\text{good}, \text{bad}\}$ $B = \{\text{dog}, \text{cat}\}$

$A \cdot B = \{\text{gooddog}, \text{goodcat}, \text{baddog}, \text{badcat}\}$

Star $A^* = \{w_1 w_2 \dots w_k : w_i \in A \text{ and } k \geq 0\}$ e.g. $B^* = \{\text{e}, \text{dog}, \text{cat}, \text{dogdog}, \text{catcat}, \text{dogcat}, \text{catdog} \dots\}$

Theorem: if A and B are regular, so is $A \cup B$.

Idea: M_u



Proof: $\exists M_A = (K_A, \Sigma, \delta_A, s_A, F_A)$ accepts A

假设 AB
字符集同
(否则 union)

$\exists M_B = (K_B, \Sigma, \delta_B, s_B, F_B)$ B .

$M_u = (K_u, \Sigma, \delta_u, s_u, F_u)$

平行, 同时跑

$s_u = (s_A, s_B)$

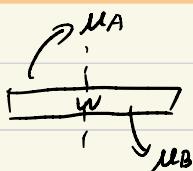
$F_u = \{(q_A, q_B) \in K_A \times K_B : q_A \in F_A \text{ or } q_B \in F_B\}$

δ_u : for any $q_A \in K_A, q_B \in K_B$, any $a \in \Sigma$

$\delta_u((q_A, q_B), a) = (\delta_A(q_A, a), \delta_B(q_B, a))$

Theorem: if A and B are regular, so is $A \circ B$.

Idea:

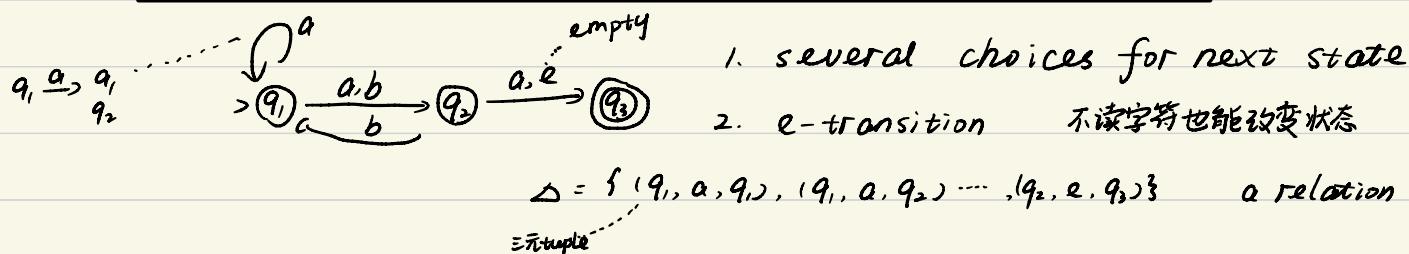


切在哪里? unknown!

Non-determinism 非确定性

确定:
 $q \xrightarrow{a} "function"$
 唯一确定 $(s, w) \xrightarrow{m} t_m(q, e)$ unique for each w \Rightarrow deterministic f auto (DFA)

non - ... (NFA)

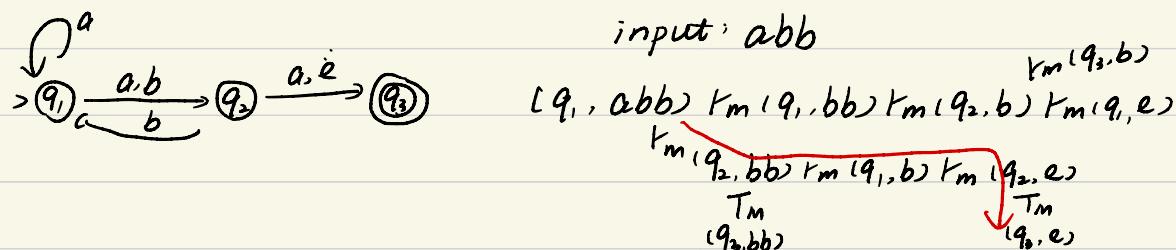


A NFA is a 5-tuple $(Q, \Sigma, \Delta, s, F)$
 transition relation $\Delta \subseteq Q \times \Sigma \cup \{\epsilon\} \times Q$

configuration $(q, w) \in Q \times \Sigma^*$

t_m t_m^*

Example

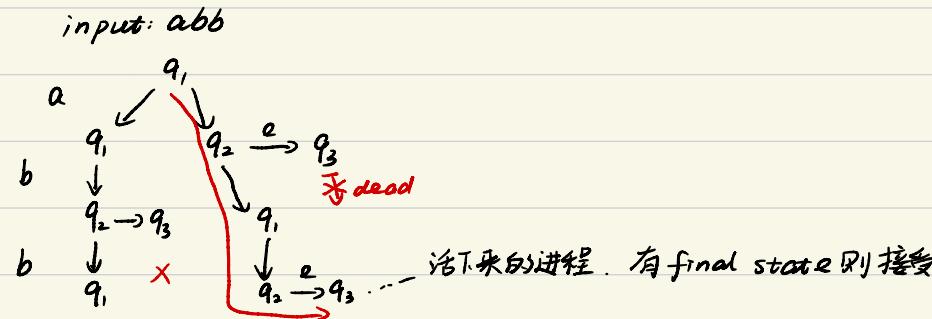
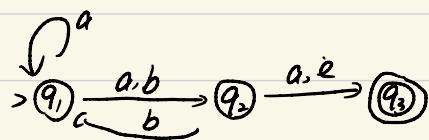


M accepts w if $(s, w) \xrightarrow{m^*} (q, e)$ for some $q \in F$
 存在一条路即可

$L(M) = \{w \in \Sigma^*: M \text{ accepts } w\}$. M accepts $L(M)$

“理解角度”(并非真实施逻辑)

Parallel



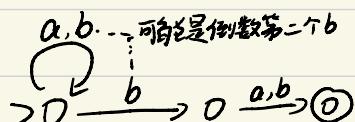
Magic

always make the right guess.

Example:

倒数第二个

★ $L = \{w \in \{a,b\}^*: \text{the second symbol from the end of } w \text{ is } b\}$

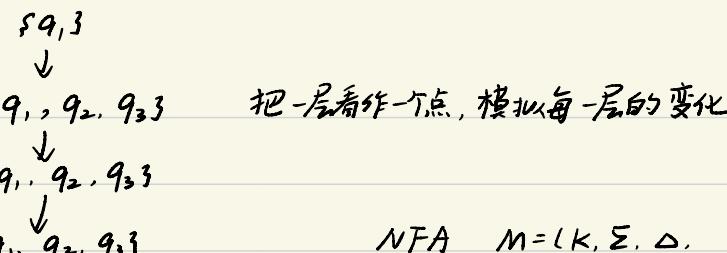
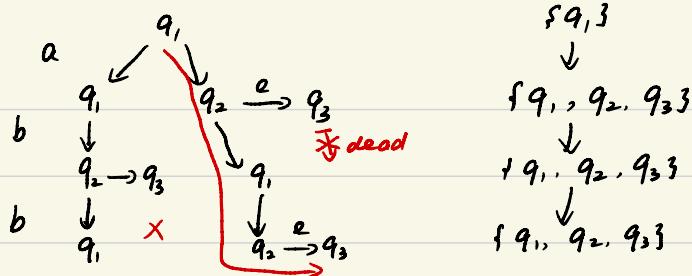


Theorem: ① $\forall \text{DFA } M \rightarrow \exists \text{NFA } M' . \text{s.t. } L(M') = L(M)$

DFA也是一种特殊的NFA

② $\forall \text{NFA } M \rightarrow \exists \text{DFA } M' . \text{s.t. } L(M) = L(M')$

Idea: DFA M' simulate “tree-like” computation of M



NFA $M = (K, \Sigma, \Delta, s, F)$
DFA $M' = (K', \Sigma, \delta, s', F')$

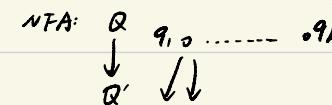
$$K' = 2^K = \{Q : Q \subseteq K\}$$

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

$$S' = \overbrace{\{S\}}^{\text{从 } S \text{ 出发, 不读 symbol 情况下能到的点}} \cup \{E(S)\} \quad (\text{可能有: } S \xrightarrow{\epsilon} q_1 \xrightarrow{\epsilon} q_2)$$

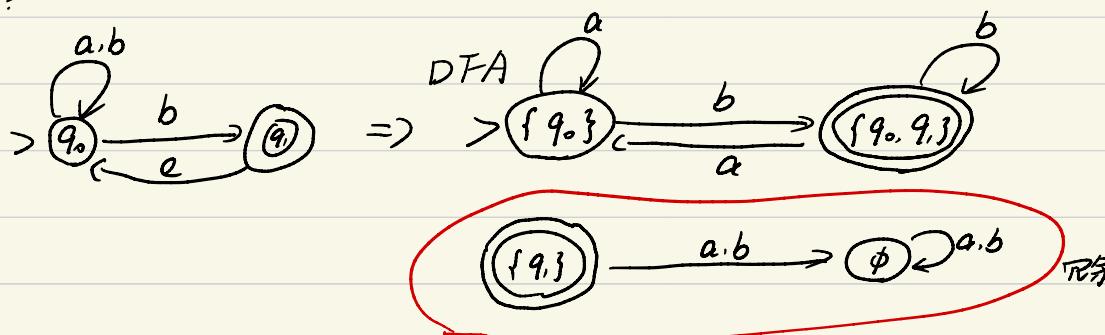
从 q 出发, 不读 symbol 情况下能到的点
 $\forall q \in K, E(q) = \{p \in K : (q, p) \in \Delta^*(p, q)\}$

$$S : \text{for } \forall Q \subseteq K, \forall a \in \Sigma. \quad S(Q, a) = \bigcup_{q \in Q} \bigcup_{p: (q, a, p) \in \Delta} \{p\}$$



Example

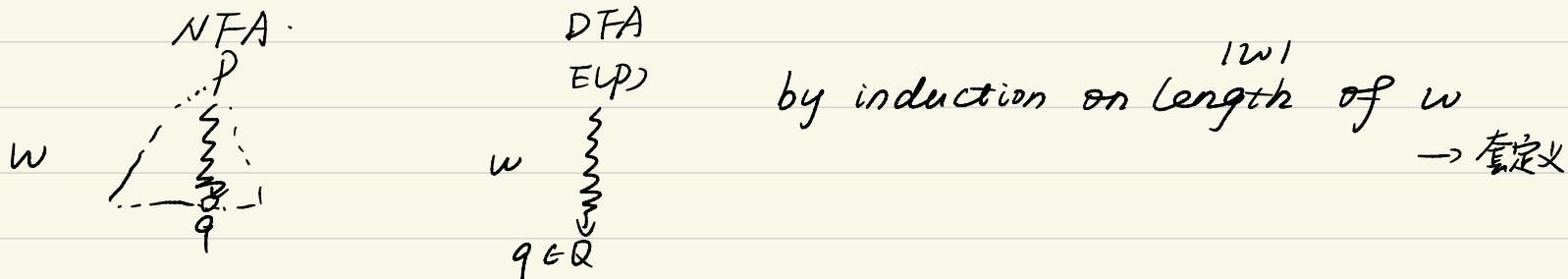
NFA:



证明: NFA M accepts $w \Leftrightarrow$ DFA M' accepts w .

Claim. for $p, q \in Q$ and $w \in \Sigma^*$.

$(p, w) \vdash_M^* (q, e)$ iff $(\text{ELP}_p, w) \vdash_{M'}^* (Q, e)$ for $q \in Q$.



由 \vdash_M^* claim 成立: M accepts $w \Leftrightarrow (s, w) \vdash_M^* (q, e)$ with $q \in Q$

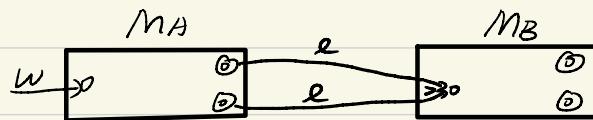
$\Leftrightarrow (\text{ELP}_s, w) \vdash_{M'}^* (Q, e)$ with $Q \ni q \quad \begin{cases} Q \cap F \neq \emptyset \\ Q \subseteq F' \end{cases}$

$\Rightarrow M'$ accepts w .

Corollary: regular $\Leftrightarrow \exists \text{NFA}$

Theorem: if A and B are regular, so is $A \circ B$.

Proof: \exists NFA M_A, M_B accepts A and B .



$A ; B$
input:

:

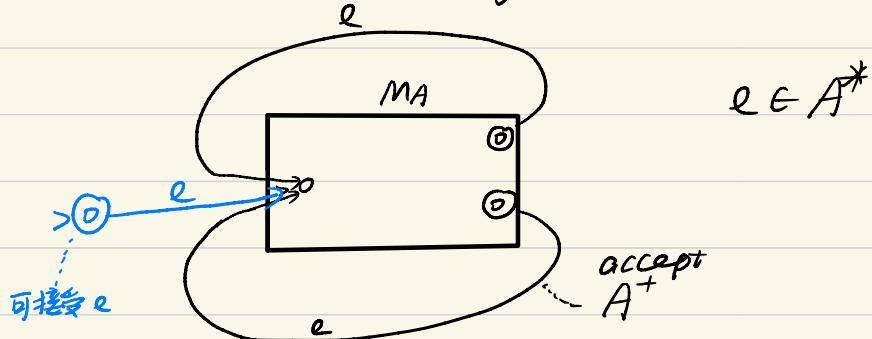
$$M_A = (K_A, \Sigma, \Delta_A, S_A, F_A)$$

$$M_B = (K_B, \Sigma, \Delta_B, S_B, F_B) \Rightarrow M^{\circ} = (K^{\circ}, \Sigma, \Delta^{\circ}, S^{\circ}, F^{\circ})$$

$$K^{\circ} = K_A \cup K_B \quad S^{\circ} = S_A \quad F^{\circ} = F_B$$

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

Theorem: if A is regular, so is A^* .



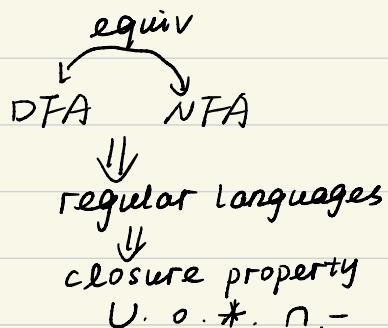
$$M_A = (K_A, \Sigma, \Delta_A, S_A, F_A)$$

$$M^* = (K^*, \Sigma, \Delta^*, S^*, F^*)$$

$$K^* = K_A \cup \{S^*\}$$

$$F^* = F_A \cup \{S^*\}$$

$$A^* = \Delta_A \cup \{(q, e, S_A) : q \in F_A\} \cup \{(S^*, e, S_A)\} \quad \checkmark \text{构造写BPO}$$



Regular Expression (REX)

$$R = (a \cup b)^* a$$

表达式: $L(R) = (fa \cup fb)^* \cdot fa$ 在 a 后面是 ab*

Atomic
symbol

$$\phi. \quad L(\phi) = \phi$$

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

composite $\cup \circ \cdot ^*$

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

$$R_1 \circ R_2 \quad L(R_1 \circ R_2) = L(R_1) \circ L(R_2)$$

$$R^* \quad L(R^*) = (L(R))^*$$

Precedence: $* > \circ > \cup$

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

Example. language 表达式
 $\{a\}^* \cup \{\phi\}^*$

$\{w \in (a,b)^*: w \text{ starts with } a \text{ and ends with } b\} \quad a(a \cup b)^* b$

$\{w \in (a,b)^*: w \text{ contains at least 2 } a's\} \quad (a \cup b)^* a (a \cup b)^* a (a \cup b)^*$

Theorem: A language A is regular (\Rightarrow) there is some REX R with $L(R) = A$
(只需证 $NFA \rightleftharpoons REX$)

$$L(M) = L(R) \xrightleftharpoons{M \leftarrow R}$$

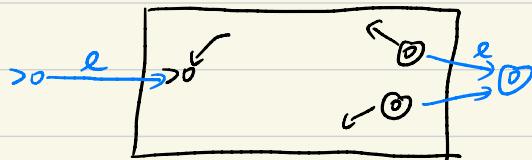
$R \rightarrow NFA M$

$NFA M \longrightarrow REX R$ s.t. $L(R) = L(M)$

(1) simplify M

a) no arc enters the initial state

b) only one final state with no arc leaving it.



(2) eliminate states

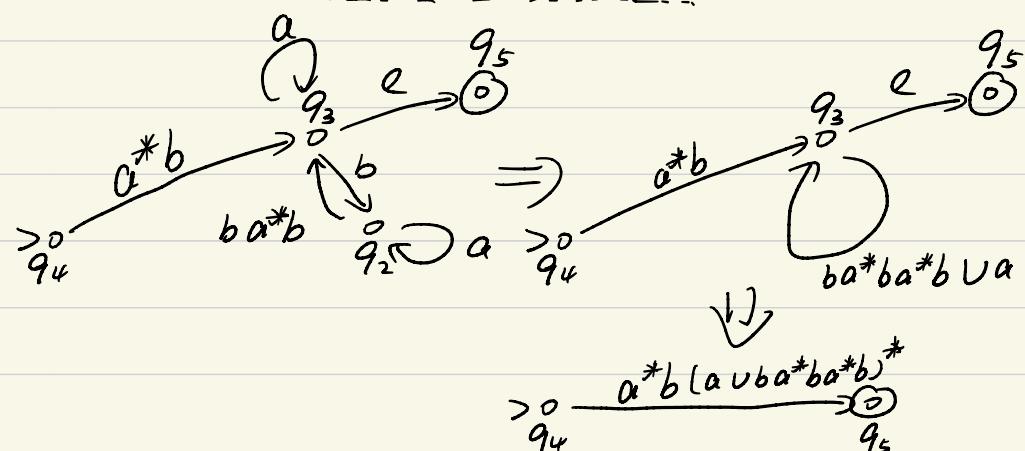
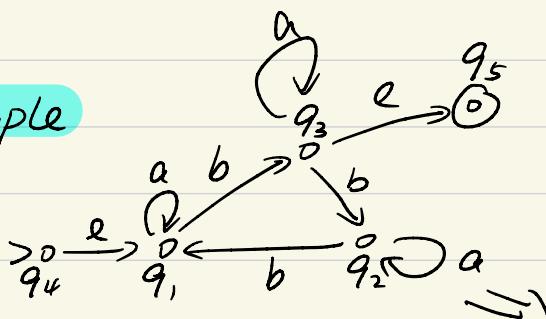


e.g. $q_0 \xrightarrow{a} q_1 \xrightarrow{b} q_2 \Rightarrow q_0 \xrightarrow{a+b} q_2$

$$q_0 \xrightarrow{a} q_1 \xrightarrow{b} q_2 \Rightarrow q_0 \xrightarrow{ab} q_2$$

$$\vdots \\ q_0 \xrightarrow{a} q_1 \xrightarrow{b} q_2 \xrightarrow{c} q_3 \Rightarrow q_0 \xrightarrow{abc} q_3$$

Example



Let $M = (K, \Sigma, A, s, F)$ be a NFA

$$(1) K = \{q_1, \dots, q_n\}, s = q_{n-1}, F = \{q_0\}$$

(2) $(P, a, q_{n-1}) \notin \Delta$ for any $p \in K$ and $a \in \Sigma$

(3) $(q_n, a, P) \notin \Delta$

R . s.t. $L(R) = L(M)$

(非
DP)

subproblems: for $i, j \in [1, n]$, for $k \in [0, n]$, define.

$L_{ij}^k = \{w \in \Sigma^*: w \text{ drive } M \text{ from } q_i \text{ to } q_j \text{ with no intermediate state having index } > k\}$

e.g. $L_{ii}^0 = \{a, e\}$ $\triangleleft aa$ is wrong since $q_0 \xrightarrow{a} q_i \xrightarrow{a} q_0$
 $i > 0$

$$R_{ii}^0 = \emptyset^* \cup a$$

$$L_{13}^0 = \{b\}$$

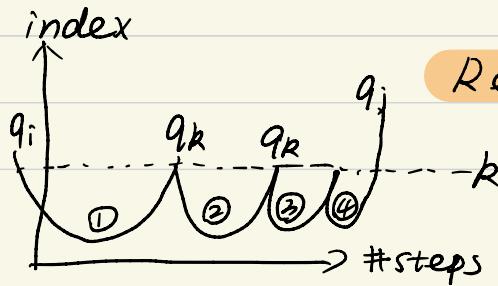
$$L_{41}^1 = \{e, a, aa, \dots\} =$$

$$\text{ans : } R_{(n-1)n}^{n-2}$$

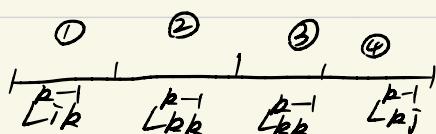
Base case: $k=0$

if $i=j$ $L_{ii}^0 = \{e\} \cup \{a: (q_i, a, q_i) \in \Delta\}, R_{ii}^0$

$i \neq j$ $L_{ij}^0 = \{a: (q_i, a, q_j) \in \Delta\}, R_{ij}^0$



Recurrence



$$L_{ij}^k = L_{ij}^{k-1} \cup L_{ik}^{k-1} \circ (L_{kk}^{k-1})^* \circ L_{kj}^{k-1}$$

$$R_{ij}^k = R_{ij}^{k-1} \cup R_{ik}^{k-1} (R_{kk}^{k-1})^* R_{kj}^{k-1}$$

(从第 j 状态 \Rightarrow j)

Pumping theorem

Let L be regular language. There exists an integer $p \geq 1$ such that for $w \in L$ with $|w| \geq p$, we can divide w into 3 pieces $w = xyz$ satisfying

(1) for any $k \geq 0$, $xy^kz \in L$

(2) $|y| \geq 1$

(3) $|xy| \leq p$

$\exists p \geq 1$

for any $w \in L$ with $|w| \geq p$

只要串足够长，一定能抽出 y . (DFA 状态有限，总会经历重复状态)

Proof:

If L is finite, let $p = \max_{w \in L} |w| + 1 \rightarrow \exists$ string

Assume L is infinite.

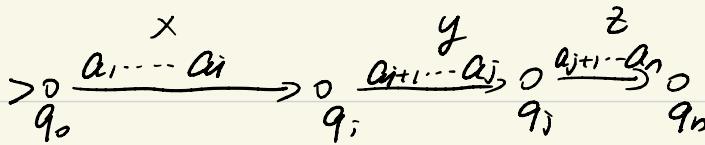
L is regular $\Rightarrow \exists$ DFA M accepting L .

Let $p = \# \text{states of } M$.

Take any $w \in L$ with $|w| \geq p$

$$w = a_1 \dots a_n \xrightarrow{q_0} q_1 \xrightarrow{a_1} q_2 \xrightarrow{a_2} \dots \xrightarrow{a_{n-1}} q_n$$

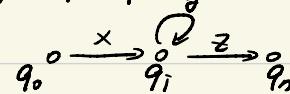
$\exists 0 \leq i < j \leq p$, $q_i = q_j$, $\forall k$, q_i, q_j 为界三份



$$(2) |y| = j - i \geq 1 \quad (3) |xy| = j \leq l$$

\uparrow

(1) $xy^kz \in L$ for any $k \geq 0$



Example. prove $\{0^n 1^n : n \geq 0\}$ is not regular

By pumping theorem, L is regular. Let p be the pumping length given by the pumping theorem.

By pumping theorem, $0^p 1^p \in L$ can be written as

1) for any $k \geq 0$, $xy^k z \in L$

2) $|y| \geq 1$

3) $|xy| \leq p$

2) $\Rightarrow y = 0^t$ for some $t \geq 1 \Rightarrow xy^*z = 0^{p-t} 1^p \notin L$

contradicting (1)

Example. $f(w) f(0,1)^*$: w contains equal numbers of 0's and 1's is not regular.

用 pumping theorem, Assume L is regular

$L \cap a^* b^*$ is regular

$f(0^n 1^n : n \geq 0)$

Regular Languages

DFA
↓
NFA

Closure. \cup . \cap . \circ . $*$. $^{-}$

REX

pumping theorem (regular 的必要条件)

Context-free language

Context-free grammar (CFG)

左边可由替换为右边

$S \rightarrow aSb$ S : start symbol

$S \rightarrow A$ S, A : non-terminal

$A \rightarrow a$ a, b, c : terminal

$A \rightarrow \epsilon$

$S \xrightarrow{1} aSb \xrightarrow{1} a\alpha S\beta b \xrightarrow{2} aaA\beta b \xrightarrow{4} aabb$ 不断替换直到全是 terminals

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

- V : a "finite" set of symbols

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

$V - \Sigma$: the set of non-terminals

- $S \subseteq V - \Sigma$: start symbol

- $R \subseteq (V - \Sigma) \times V^*$
non-terminal $\rightarrow w \in V^*$ e.g. $S \rightarrow aSb$

for any $x, y, u \in V^*$, for any $A \in V$.

$$x A y \underset{\downarrow}{\Rightarrow}_G x u y \text{ if } (A, u) \in R$$

derive in one step.

for any $w, u \in V^*$

$$w \underset{\text{terminals}}{\Rightarrow}_G^* u \text{ if } w = u \text{ or } w \underset{\text{derive from } w \text{ to } u \text{ of length } n}{\underbrace{\Rightarrow_G \dots \Rightarrow_G}} u$$

G generates a string $w \in \Sigma^*$ if $s \underset{\text{derives}}{\Rightarrow}_G^* w$

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

G generates $L(G)$

Definition: A language is context-free if some CFG generates it.

Example: $\{ w \in \{a, b\}^* : w = w^R \}$ is context-free

$$S \rightarrow e \mid a \mid b \mid aSa \mid bSb$$

Definition:

A CFG is in Chomsky normal form (CNF) if

every of its rule is one of the following form:

1. $S \rightarrow e$

2. $A \rightarrow BC$ for some $B, C \in V - \Sigma - \{S\}$

3. $A \rightarrow a$ for some $a \in \Sigma$

CNF 生成一个长为 n 的串，需要 $2n-1$ 步

Theorem:

BFCFG \longrightarrow CFG in CNF

proof sketch

1. S appears RHS \Rightarrow new start symbol S_0 , $S_0 \rightarrow S$

2. $A \rightarrow e$ for some $A \neq S$

e.g. $B \rightarrow ACA \rightarrow CA \underline{AC} \underline{C}$ 删去后补上 $B \rightarrow CA$ 向前补偿
 $B \rightarrow AC$
 $B \rightarrow C$

3. $A \rightarrow B$ for some $B \in V - \Sigma$

e.g. $A \cancel{\rightarrow} B \rightarrow CDE$ 删去后补上 $A \rightarrow CDE$ 向后补偿

4. 若 $A \rightarrow u_1 u_2 \dots u_k$ $k \geq 3$

$\Rightarrow A \rightarrow u_1 v_2$ 右边长度为2

$v_2 \rightarrow u_2 v_3$

\vdots

$v_{k-1} \rightarrow u_k u_k$

terminal

5. $A \rightarrow u_1 u_2$ at least one $u_i \in \Sigma$

$A \rightarrow a_1 B \Rightarrow A \rightarrow A_1 B$

$A_1 \rightarrow a_1$

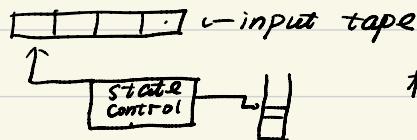
e.g. $C \cancel{\rightarrow} ADA$ 不能补 $C \rightarrow BDA$
 ADA
 BDB

\therefore 若 $S = A$, 则 S 不能出现在 RHS

Pushdown Automata (PDA)

$PDA \Leftrightarrow CFG$

$PDA = NFA + stack$



根据 input 和 stack 里元素决定下一步

Definition:

A PDA is a 6-tuple $P = (K, \Gamma, \Sigma, \Delta, S, F)$

$\begin{matrix} \text{state} & \text{input} \\ \downarrow & \downarrow \\ K & \Sigma \\ \downarrow & \downarrow \\ \text{stack} & \text{symbol} \\ \downarrow & \downarrow \\ \text{alphabet} & \end{matrix}$

Δ : transition relation

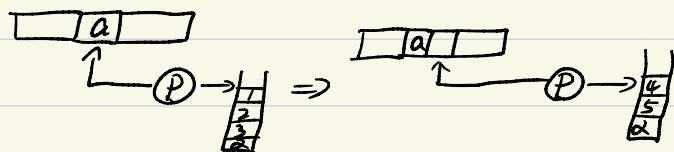
a finite "subset" of $(K \times (\Sigma \cup \{\epsilon\})^*) \times (\Gamma^*)^* \times (K \times \Gamma^*)$

a string at the top of stack $\xrightarrow{\Delta}$ push onto stack
pop

跳到次态，同时压进堆，push新串

Example:

$((p, a, 123), (q, 45))$

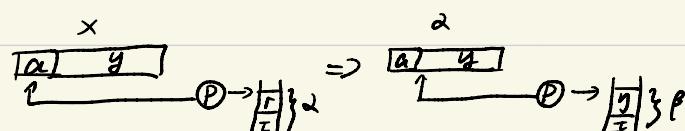


$((p, a, e), (q, p))$

无论栈内有什么，均可匹配

A configuration of P is a member of $K \times \Sigma^* \times \underbrace{\Gamma^*}_{\text{stack element}}$

$(p, x, \alpha) \xrightarrow{p} (q, y, \beta)$ if $\exists ((p, a, \alpha), (q, \gamma)) \in \Delta$ s.t. $x = ay$, $\alpha = \gamma T$ and $\beta = \gamma T$ for some $T \in \Gamma^*$



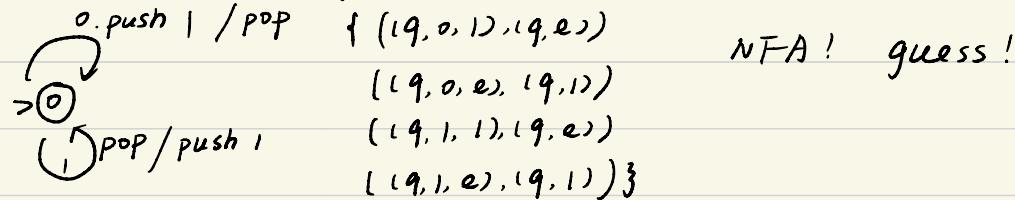
$(P, x, \alpha) \vdash_p^* (q, y, \beta)$ if $(P, x, \alpha) = (q, y, \beta)$ or $(P, x, \alpha) \vdash_p \dots \vdash_p (q, y, \beta)$

P accepts $w \in \Sigma^*$ if
① final
② input string
③ stack
 $(S, w, e) \vdash_p^* (q, e, e)$ for some $q \in F$

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

P accepts $L(P)$

Example. $\{w \in \{0, 1\}^* : \# 0's = \# 1's\}$



1. $CFG \rightarrow PDA$

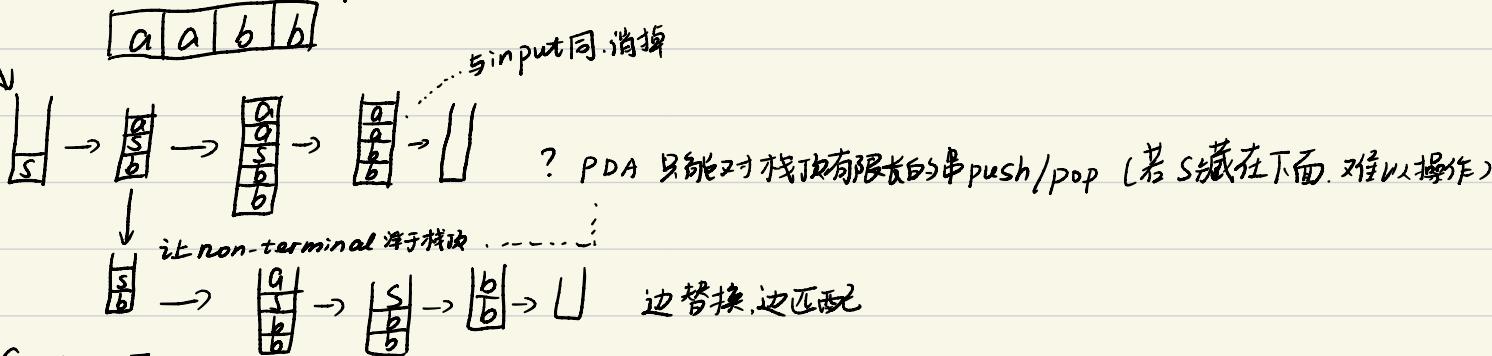
2. CFL properties: closure properties. pumping theorem

$CFG \quad G \rightarrow PDA \quad M \quad s.t. L(M) = L(G)$

Idea:

$$\begin{aligned} S &\rightarrow aSb \\ S &\rightarrow e \end{aligned}$$

1. in stack, non-deterministically generate a string from S .
2. compare it to the input
3. accept if match



Given $G = (V, \Sigma, S, R)$

$$\Rightarrow P = (K, \Sigma, T, \Delta, s, F)$$

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

$$T = V$$

$$\Delta = \{(s, e, e), (f, s)\}$$

① 推 s 入栈

$$(f, a, a), (f, e) \text{ for each } a \in \Sigma \quad ② \text{ 栈顶消掉 terminal }$$

$$(f, e, A), (f, u) \text{ for each } (A, u) \in R \quad ③ \text{ 栈顶 non-terminal } \rightarrow \text{ 非确定消掉}$$

PDA \rightarrow CFG
↓
Simple PDA

If $|F|=0$, trivial
Assume $|F| \geq 1$

Def: A PDA $M = (K, \Sigma, T, \Delta, s, F)$ is simple if

(1) $|F|=1$ and

(2) for each transition $((p, a, \alpha), (q, \beta)) \in \Delta$

either $\alpha = e$ and $|\beta| = 1$ 要么只push-↑, 要么只pop-↑

or $|\alpha| = 1$ and $\beta = e$

PDA \rightarrow simple PDA

1. $|F| \neq 1$ add a new state F'

for each $q \in F$. add a new transition $((q, e, e), (f, e))$
 $F := \{f\}$

2. 2.1 $|\alpha| \geq 1$ and $|\beta| \geq 1$ push.pop

2.2 $|\alpha| \geq 1$ and $\beta = e$ push > 1 元素

2.3 $\alpha = e$ and $|\beta| \geq 1$ pop > 1

2.4 $\alpha = \beta = e$ nop

2.1 $((p, a, \alpha), (q, \beta))$ with $|\alpha| \geq 1$ and $|\beta| \geq 1$

└ add new state r

replace it with $((p, a, \alpha), (r, e))$

$((r, e, e), (q, \beta))$

pop α

push β

先pop 后push

2.2 $((p, q, \alpha), (q, \beta))$ with $\beta = e$, $\alpha = c_1 c_2 \dots c_k$, $k \geq 2$

add $k-1$ new states $\Gamma_1, \dots, \Gamma_{k-1}$

$((p, q, c_1), (q, e))$ 拆成 k 步

$((\Gamma_1, e, c_2), (\Gamma_2, e))$

:

$((\Gamma_{k-1}, e, c_k), (q, e))$

2.3 同理

2.4 $((p, q, e), (q, e))$

add a new state Γ

pick $b \in T$

$((p, q, e), (\Gamma, b))$ 先 push 再 pop 出来 (同一个元素)

$((\Gamma, e, b), (q, e))$

Simple PDA \rightarrow CFG

Given a simple PDA $M = (K, \Sigma, T, \Delta, S, f_f)$ $\Rightarrow G = (V, \Sigma, S, R)$

\rightarrow subproblem

Nonterminal: $\{A_{pq} : \text{for any } (p, q) \in K \times K\}$

Goal: $A_{pq} \Rightarrow^* w \in \Sigma^*$ if and only if $(p, w, e) \xrightarrow{M}^* (q, e, e)$ 希望制定只使这次成立

$\therefore S = A_{sf}$ (\because)

我们希望 $L(G) = L(M)$

$S \Rightarrow^* w \text{ iff } w \in \underline{L(M)}$

well(?) \cdots $(S, w, e) \xrightarrow{M}^* (f, e)$

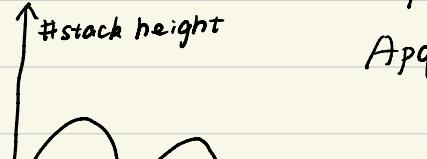
R:

(recurrence)

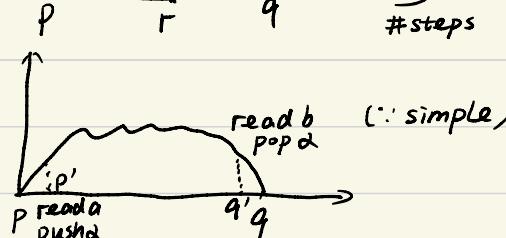
① $\forall p \in K$

$App \rightarrow e$

② $\forall p, q \in K$

i) 
 $Apq \rightarrow Apr Arg \quad \text{trek}$ → 极端.

$Apq \rightarrow aAp'q'b \quad \forall ((p, a, e), (p', a)) \in \Delta \text{ for some } a \in T$
 $((q', b, e), (q, e))$

iii) 
read a push
read b pop p'
 $(\because \text{simple})$

Prove that $Apq \Rightarrow^* w \in \Sigma^*$ iff $(p, w, e) \xrightarrow{M}^* (q, e, e)$

\Rightarrow by induction on length of derivations from Apq to w

\Leftarrow by induction on #steps of computation

PDA $\xrightarrow{\text{defines}}$ CFL

Theorem.

Every regular language is context-free. ($\because NFA \rightarrow PDA \rightarrow CFL$)

CFL closure properties U. o. * ✓

∩. A X

A and B are context-free, so are $A \cup B$, $A \cdot B$, A^* .

$$G_A = (V_A, \Sigma, S_A, R_A)$$

$$G_B = (V_B, \Sigma, S_B, R_B)$$

$$G_{A \cup B} : S \rightarrow S_A \mid S_B$$

$$G_{A \cdot B} : S \rightarrow S_A S_B$$

$$G_{A^*} : S \rightarrow \epsilon \mid S A S$$

$$A = \{a^i b^j c^k : i=j\} \text{ context-free}$$

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

$$A \cap B = \underline{\{a^n b^n c^n : n \geq 0\}}$$

not context-free (by pumping theorem)

$$A \cap B = \overline{A \cup B} \quad \therefore \text{补集也不封闭 (既然 } A \cap B \text{ 也封闭)}$$

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 5 pieces $w = uvxyz$ satisfying

(1) $uv^i x y^i z \in L$ for any $i \geq 0$

(2) $|v| + |y| > 0$ 不能同时为空

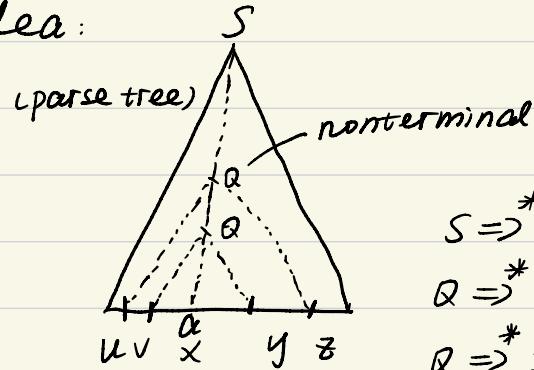
(3) $|vxy| \leq p$

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

$$ab = e \cdot a \cdot e \cdot b \cdot e$$

$u \quad v \quad x \quad y \quad z$

Idea:



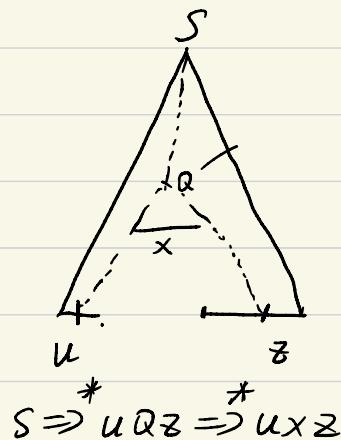
- $\frac{1}{2}$ path. 除了 leave 均是 non-terminal

path 长

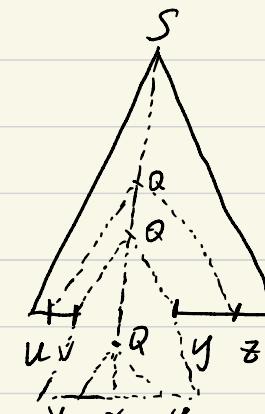
如有重复的 non-terminal

这里选最长的 $SQRQA$

$$\begin{aligned} S &\Rightarrow^* u Q z \\ Q &\Rightarrow^* v Q y \\ Q &\Rightarrow^* x \end{aligned}$$



$$S \Rightarrow^* u Q z \Rightarrow^* u x z$$



$$S \Rightarrow^* u v^2 x y^2 z$$

L is context-free $\Rightarrow \exists G = (V, \Sigma, S, R)$ generates L

Let $b = \max \{ |w| : (A, w) \in R\}$ ^{CFG} 最多儿子数 (规则右边的最长长度)



Fact: if a tree with $\text{fanout} \leq b$ has n leaves. then its height $\geq \log_b n$

(# edges of the longest descending path)

define $p = b^{|V-\Sigma|+1}$. pick $w \in L$ with $|w| \geq p$

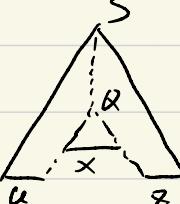
Let T be ^a parse tree that yields w (with smallest number of nodes)
 height of $T \geq \log_b p = |V-\Sigma|+1$
 $\# \text{edges} \geq |V-\Sigma|+1$
 $\# \text{nodes} \geq |V-\Sigma|+2$
 $\# \text{non-terminals} \geq |V-\Sigma|+1$
 \Downarrow
 some non-terminal Q appears at least twice
 choose the lowest pair

(1) $uv^ixy^jz \in L$ for any $i \geq 0$ ✓

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

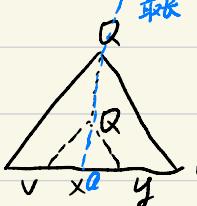
反证 if $v = y = e$.

$$w = uxz$$



is smaller than T . contradiction

(3) $|vxy| \leq p$



只用证
 $\text{height} \leq |V-\Sigma|+1 ?$
 $\Rightarrow |vxy| \leq \# \text{Leaves} \leq b^{|V-\Sigma|+1} = p$

height: length of QQA . (\because SQQR ~~最短~~)

if every non-terminal appears at most once in the path (excluding endpoints)

选 Q 时, 选最低的 - 对 pair



$\{a^n b^n c^n : n \geq 0\}$

assume it is context-free. Let p be the pumping length.

pick $a^p b^p c^p \in L$

By pumping theorem. $a^p b^p c^p = uvxyz$

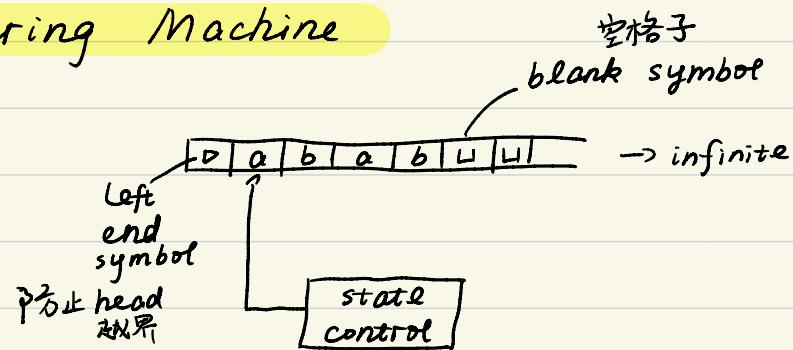
(3) $|vxy| \leq p \Rightarrow$ at least one of a and c

$\underbrace{a \dots a}_P \underbrace{b \dots b}_P \underbrace{c \dots c}_P$

does not appear in v or y .

$uv^*y^*z \in L$ contradiction

Turing Machine



1. $\leftarrow . \rightarrow$

2. read & write

Definition:

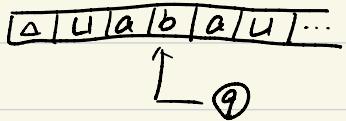
A Turing machine is s -tuple $M = (K, \Sigma, \delta, s, H)$

- K : a finite set of states
- Σ : tape alphabet (containing D and U)
- $s \in K$: initial state
- $H \subseteq K$: a set of halting states
- δ : transition function

不能是.....
halt
 $(K - H) \times \Sigma \xrightarrow{\text{移动}} K \times [f \leftarrow \rightarrow] \cup (\Sigma - \{D\})$
当前格里的元素 head action

satisfy for any $q \in K$

在最左端
只能 \rightarrow , 不能 \leftarrow . 也不能 overwrite
 $\delta(q, D) = (p, \rightarrow)$ for some p



$(q, D U \underline{a} b | a U \dots) \Leftrightarrow (q, D U ab, a)$

特殊

$(q, D U \underline{a} b a) \Leftrightarrow (q, D U a b a, e)$

无#symbol

A configuration a member of $K \times D(\Sigma - \{\Delta\})^* \times \{e\} \cup (\Sigma - \{\Delta, \#\})^* (\Sigma - \{\Delta, \#\})^*$

$(q_1, D w_1 \underline{a}_1 u_1) \Gamma_m (q_2, D w_2 \underline{a}_2 u_2)$ if

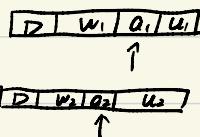
1) // writing

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

2) // moving left

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

(if $a_1 = L, u_1 = e$ then $u_2 = e$)



③ // moving right

$(q_1, D w_1 \underline{a}_1 u_1) \Gamma_m^* (q_2, D w_2 \underline{a}_2 u_2)$ if

① " " = " " or

② " $\Gamma_m \dots \Gamma_m \dots \Gamma_m$ " $n \geq 1$ steps

$(q, D w a u)$ is a halting config if $q \in H$

#?/n initial config (S, ?)

固定

Fix Σ .

(1) symbol writing machine Ma ($a \in \Sigma - fD_3$) 作用: $\dots \dots \dots \text{不写 } A$.



$M_a = (\{s, h\}, \Sigma, S, s, sh)$ for each $b \in \Sigma - \{D\}$,



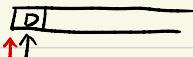
$$S(s,b) = (h,a)$$

$$\delta(s, d) = (s, \rightarrow)$$

(2) head moving machine MC M- 左/右移读写头



若在 D. 则不动



basic machines: Ma. Ml. Mr

$$a \quad < \quad R$$

aubunc

Left-shifting machine S_L

for any $v \in (\Sigma - \text{f.d.} \cup \{\})^*$

D U U W W U → D U W W 整体左移一格

Example

$$M_1 \xrightarrow{o} M_2$$

$\downarrow I$

$$M_3$$

1. run M_1 , until it halts
 2. if the current symbol is 0, run M_2
 3. - - - - - |, run M_3

4. else halt.

$$R \xrightarrow[\Downarrow]{\Sigma} R$$

$\Rightarrow RR \Leftrightarrow R^2$

$R_u : > R \boxed{U}$ 非空格
: 找到当前读写头右第一个空格

$R \bar{u} > R \boxed{U}$ 非空格 (可能不会 halt. 即全是 空格)

$L_u \boxed{L} \bar{U}$ $L \bar{u} > \boxed{L} U$

∴ S_L 可以这样表示
 $> L_u \rightarrow R \xrightarrow{Q \neq U} L \bar{U} a R$

当前写空格
先移到左边第一个空格

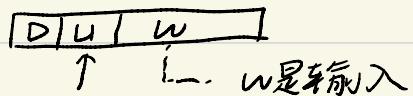
Recognize Language

$$M = (K, \Sigma, S, S, H)$$

通过是否停机
判定语言

input alphabet $\Sigma_0 \subseteq \Sigma - \{\$D,U\}$

initial config: $(S, D \underline{U} w)$



$$L(M) = \{w \in \Sigma^*: (S, D \underline{U} w) \xrightarrow{*} (h, D w \text{ for some } h \in H)\}$$

M semidecides $L(M)$ (需要时间可能很长, 无法确定下一秒是否 halt)

(recognizable)

Recursively enumerable if some TM semidecide it.

Let $M = (K, \Sigma_0, \Sigma, S, s, f_y, n)$ be a TM.

We say M decides a language $L \subseteq \Sigma_0^*$ if

(1) for every $w \in L$,

$(s, D_u w) \vdash_m^* (y, \dots)$ we say M accepts w .

(2) for every $w \in \Sigma_0^* - L$

$(s, D_u w) \vdash_m^* (n, \dots)$ rejects

A language is recursive (decidable) if some TM decides it.

Theorem:

If L is recursive, it must recursively enumerable.

判定更强

Compute functions

for $w \in \Sigma_0^*$, if (1) 图灵机还可用来自计算函数
if $(s, D_u w) \vdash_m^* (h, D_u y)$ for $h \in H$. $y \in \Sigma_0^*$ (2)

input

DUIy

↑

output

$y = M(w)$

是 recursive/computable

for any $f: \Sigma_0^* \rightarrow \Sigma_0^*$, we say M computes f if for any $w \in \Sigma_0^*$,
 $M(w) = f(w)$

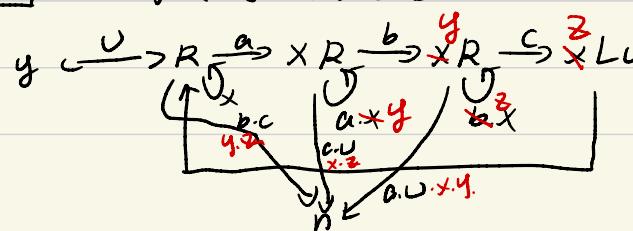
Example. $\{a^n b^n c^n : n \geq 0\}$ is recursive.

D U X a | X b | X c | U U

↑

↑

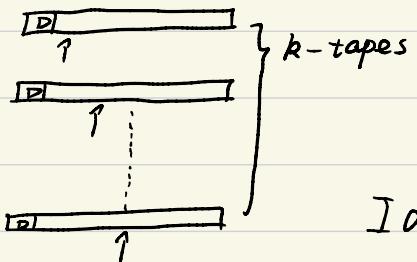
每次删一个 a.b.c



abc. abc ?

把叉变为 x.y.z

1. multiple tapes



$$S: (k-H) \times \Sigma^k \longrightarrow k \times (\{\Sigma - \{\}\} \cup \{\leftarrow, \rightarrow\})^k$$

Idea: 3-tapes

D	a	b	a	b	a	U	U
D	b	a	g	U	U		
D	b	a	a	U	U		

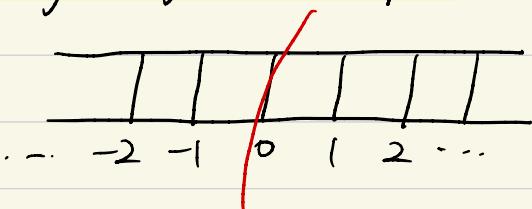
single tape

D	a	b	a	U	U
D	b	a	a	U	..
	b	a	U	U	U

字数: 16

D	a	b	b	a	a	U	U	U
	a	b	c	a	b	c	3^3	

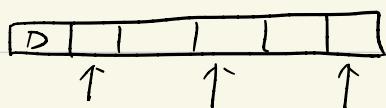
2. Two-way infinite tape



用 2-tape 模拟



3. multiple head

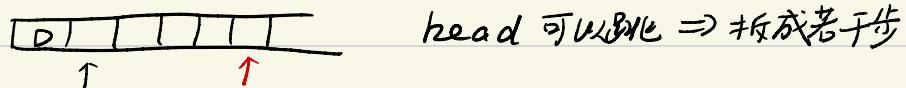


每次扫一遍确定头的位置，再操作

4. Two-dimensional tape

0	2	3	9	...
1	4	8		
5	7			
6				

5. Random access



head 可以跳到 \Rightarrow 扩成若干步

6. non-deterministic TM (NTM)

非确定性图灵机

a NTM is a 5-tuple $(K, \Sigma, \Delta, S, H)$

Δ : relation (not function)

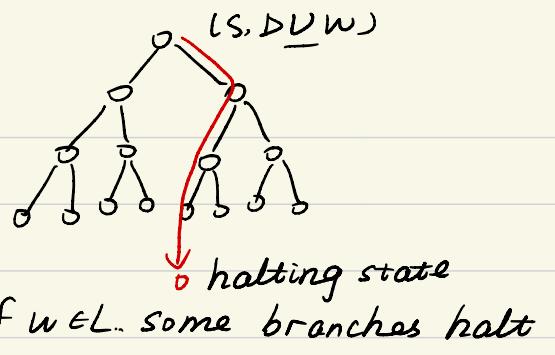
a finite subset of $((K \times H) \times \Sigma) \times (K \times ((\Sigma - \{ \Delta \}) \cup \{ \leftarrow, \rightarrow \}))$

configuration $(q, Dababb)$

$\Gamma_m \quad \Gamma_m^* \quad \overset{\wedge}{\Gamma_m} \text{ yields in } N \text{ steps}$

A NTM $M = (K, \Sigma, \Delta, S, H)$ with input alphabet Σ . semidecides $L \subseteq \Sigma^*$
if for any $w \in \Sigma^*$. $w \in L$ if and only if $\overset{\wedge}{(S, D \cup w)} \Gamma_m^*(h, \dots)$ for some $h \in H$.

存在一条路



Let $M = (K, \Sigma, A, s, \{y, n\})$ with input alphabet Σ . \$. \quad \dots \dots

M decides a language $L \subseteq \Sigma^*$ if 每一个分支均在 N 步内停止

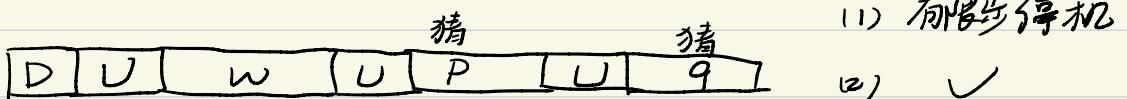
- for any $w \in \Sigma^*$. \exists a natural number N . s.t no configuration C satisfying

$\exists N \quad (S, D \cup w) \vdash_m^N C$
 BP 为输入，对应树 height < N
 (若 $w \notin L$. 则所有分支都会停在 n 上)

(2) $w \in L \iff (S, D \cup w) \vdash_m^* (y, \dots)$
 some branch halts with y .

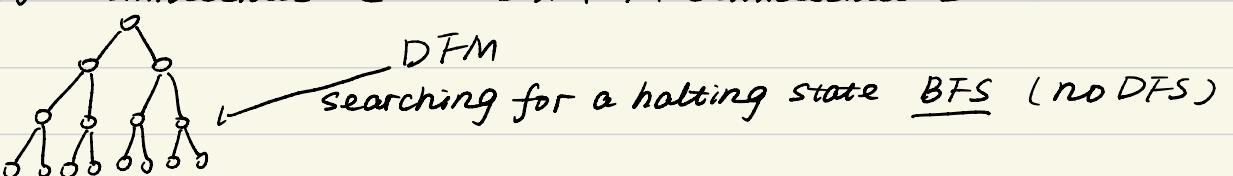
Example.

Let $C = \{ \text{binary encodings of composite numbers} \}$
 猜是否是两个数的乘积

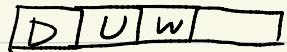


Theorem: Every NTM can be simulated by DTM.

proof (sketch): NTM N semidecides $L \rightarrow$ DTM M semidecides L



3-tape DTM to simulate N.

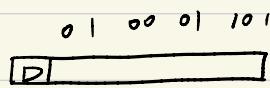


store the input



simulate N

在树上向下走



enumerate hint

记录纸带往哪走

实际中为有限个分支 (不一定 binary)

Church-Turing Thesis

算法本质就是 TM!

Intuition of algorithms equals (deterministic) Turing machines
that halts on every input.

solves

decides

(decision)

问题

problem equals languages

Fact: Any finite set can be encoded. $\{a_1, \dots, a_n\} \hookleftarrow \{0, 1\}$

A finite collection of finite sets can be encoded.

$\{A, B, C, D\} \hookleftarrow (a, b, c, d, 0, 1)$
P P
(a, 0, 1) (b, 0, 1) (c, 0, 1) (d, 0, 1)

↓
FA · PDA · TM · CFG · REX

Object $D \rightarrow "D" \text{ 表示它的编码}$

decide problem (recursive languages)

problem

R1 $A_{DFM} = \{ "D" "w" : D \text{ is a DFA that accepts } w \}$

$M_{R1} = \text{on input } "D" "w"$

by default $\begin{cases} 0.1 \text{ if input is illegal. reject} \\ 0.2 \text{ decode } "D" "w" \text{ to obtain } D \text{ and } w \end{cases}$

1. run D on w
2. if D ends with final / D accepts w
3. accept $"D" "w"$
4. else
5. reject $"D" "w"$

R2. $A_{NFA} = \{ "N" "w" : N \text{ is a NFA that accepts } w \}$

$M_{R2} = \text{on input } "N" "w"$

1. $N \rightarrow$ an equivalent DFA D
2. run M_{R1} on $"D" "w"$
3. return the result of M_{R1}

$R2 \longrightarrow R1$

$f: "N" "w" \longrightarrow "D" "w"$

对输入映射，且答案一样

$"N" "w" \in A_{NFA} \iff "D" "w" \in A_{DFA}$

A **reduction** from A_{NFA} to A_{DFA}

归约

R3 $A_{REX} = \{ R''w : R \text{ is a regular expression that generates } w \}$

$M_{R3} = \text{on input } "R''w"$

1. $R \rightarrow$ an equivalent NFA N
2. run M_{R2} on " $N''w$ "
3. return the result of M_{R2}

$f: A \rightarrow B$ and B is recursive $\Rightarrow A$ is also recursive.

R4. $E_{DFA} = \{ "D" : D \text{ is a DFA with } L(D) = \emptyset \}$

$M_{R4} = \text{on input } "D"$

1. if D has no final state
2. accept.
3. else
4. "conceptually" do BFS on the diagram
5. if there is a path from s to a final.
reject

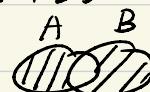
else

accept

R5. $E_{Q_{DFA}} = \{ "D_1, D_2" : D_1 \text{ and } D_2 \text{ are two DFAs with } L(D_1) = L(D_2) \}$

Hint: ① 利用 R4

② symmetric $A \oplus B = \{ x \in A \cup B \wedge x \notin A \cap B \}$



③ $A = B \Leftrightarrow A \oplus B = \emptyset$

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

$$L(D_1) = L(D_2) \Leftrightarrow (L(D_1) \cup L(D_2)) \cap (\overline{L(D_1)} \cup \overline{L(D_2)}) = \emptyset$$

\uparrow \uparrow $\parallel ?$
 D_1 D_2 D_3

M_{R5} = on input " D_1 ", " D_2 "

1. construct D_3 with $L(D_3) = L(D_1) \oplus L(D_2)$ \rightarrow 能构造吗?
2. run M_{R4} on " D_3 "
3. return the result of M_{R4} .

A, B. languages over same alphabet Σ

★ A reduction from A to B is a (computable) recursive function

$f: \Sigma^* \rightarrow \Sigma^*$ such that for $x \in \Sigma^*$, $x \in A \Leftrightarrow f(x) \in B$

reduction from EQDFA to EdFA

$f("D_1", "D_2") = "D_3"$ (with $L(D_3) = L(D_1) \oplus L(D_2)$)

$f(\text{illegal input}) = \text{illegal input}$ (reject by default)

$"D_1", "D_2" \in \text{EQDFA} \Leftrightarrow "D_3" \in \text{EdFA}$

Theorem:

If B is recursive, and \exists a reduction f from A to B, then A is recursive.

$\Rightarrow A \leq B$ (判定的难度)

Proof: $\exists M_B$ decides B .

$M_A = \text{on input } x. \xrightarrow{\text{f}} \text{reject}$

1. compute $f(x)$

2. run M_B on " $f(x)$ "

3. return the result of M_B

Example

C1 = { "G" "w" : G is a CFG that generates w }

$M_{C1} = \text{on input } "G" "w"$

1. $G \rightarrow G'$ in CNF

2. enumerate all derivations of length $2|w|-1$

3. if any of them generates w.

4. accept "G" "w"

5. else

6. reject "G" "w"

C2 $A_{PDA} = \{ P "w" : P \text{ is a PDA that accepts } w \}$

C2 $A_{PDA} \rightarrow \text{ACFG}$

"P" "w" \rightarrow "G" "w"

C3. $E_{CFG} = \{ "G" : G \text{ is a CFG with } L(G) = \emptyset \}$

$S \rightarrow A\alpha$ 从 terminal to e 例句: 若 \rightarrow 的 symbol 被标记, \rightarrow 左边 symbol 也被标记.

$A \rightarrow B\beta$ 看 start symbol 是否被标记

$B \rightarrow AC$

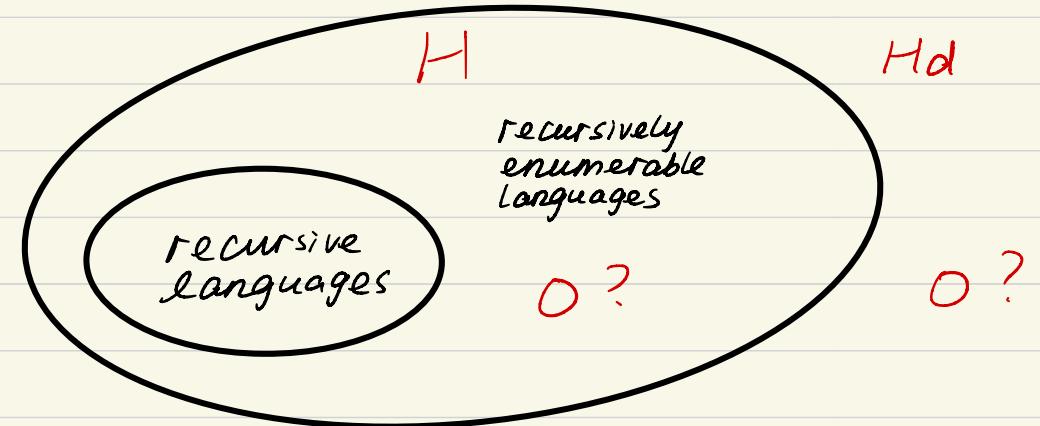
$C \rightarrow \epsilon$

$C \rightarrow \alpha$

$B \rightarrow \beta$

C4. $E_{PDA} = \{ "P" : P \text{ is a PDA with } L(P) = \emptyset \}$

$C_4 \leq C_3$



A set S is **countable** if it is finite or \exists bijective $f: S \rightarrow N$. uncountable otherwise.

Lemma. A set S is countable $\Leftrightarrow \exists$ injection $f: S \rightarrow N$

proof: $\Rightarrow \checkmark$

otherwise finite \rightarrow trivial

$\Leftarrow \exists$ injection $f: S \rightarrow N$ (assume S is infinite)

↓
label element of S as s_1, s_2, s_3, \dots

so that $f(s_1) < f(s_2) < f(s_3) < \dots$

$g(s_i) = i$

Corollary: Any subset of a countable set is countable.

Proof: A countable
 \downarrow
 \exists injection $f: A \rightarrow N \Rightarrow \exists$ injection $f': A' \rightarrow N$

Lemma. Let Σ be an alphabet. Σ^* is countable.

proof: e.g. $\Sigma = \{0, 1\}$

0, 0, 1, 00, 01, 10, 11, ...
↓ ↓ ↓ ↓
0 1 2 3 ...

要证 $\forall S \in \Sigma^*, \exists f(S)$ # strings with $\leq |S| : 2^{|S|}$

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

图灵机可以进行编码

且每台TM仅能判定一个问题

Lemma: Let Σ be some alphabet

Let L be the set of all the languages over Σ .

L is uncountable.

$\Rightarrow \exists \text{language is not recursively enumerable.}$
(TM 可数, 问题不可数)

Proof: suppose L is countable

↓

L_1, L_2, L_3, \dots

since Σ^* is countable. 所有串

S_1, S_2, S_3, \dots

构造: $D = \{S_i : S_i \notin L_i\} \subseteq L \rightarrow \text{contradiction}$

$\forall i, S_i \in D \text{ iff } S_i \notin L_i$

$\therefore D \neq L_i$ RP D 与 列出的每一个元素都不同

S_1, S_2, S_3, \dots

$L_1 \quad 1 \ 0 \ 0 \ 0 \dots$

$L_2 \quad 0 \ 1 \ 0 \ 0 \dots$

$L_3 \quad 1 \ 0 \ 0 \ 0 \dots$

L_4

取反

$D: \text{与 } L_i \text{ 每一行都不同}$

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

Theorem: H is recursively enumerable.

universal
TM $\quad U = \text{on input } \langle M, w \rangle$
1. run M on w

$$L(U) = H$$

$U \text{ halts on } \langle M, w \rangle \Leftrightarrow M \text{ halts on } w$
 $(\langle M, w \rangle \in H)$

Theorem. H is not recursive. 不可判定

Proof: $H_d = \{ \langle M \rangle : M \text{ is a TM that does not halt on } \langle M \rangle \}$

①

②

If H is recursive, so is H_d . H_d is not recursively enumerable.

① If H is recursive $\Rightarrow M_H$ decides H

$D \cup H_d = \text{on input } \langle M \rangle$

1. run M_H on $\langle M, w \rangle$ where $w = \langle M \rangle$

2. If M_H accepts $\langle M, w \rangle$

reject $\langle M \rangle$

3. else

fixe

accept $\langle M \rangle$

② Assume $\dots \Rightarrow \exists D \text{ semidecides } H_d$

D on input m $\begin{cases} \text{halt. if } m \in H_d \text{ (M does not halt on } m) \\ \text{not halt. if } m \notin H_d \text{ (M halts on } m) \end{cases}$

let $M = D$?

D halts on $\langle D \rangle \Leftrightarrow D \text{ does not halt on } \langle D \rangle$

∅

	<i>M₁</i>	<i>M₂</i>	<i>M₃</i>
<i>M₁</i>	1	0	0
<i>M₂</i>	0	1	0
<i>D</i>	0	0	1

取反

练习画 problem 与 佳康关系

If $A \leq B$ and A is not recursive, then B is not recursive.

① $A_1 = \{ \langle M \rangle : M \text{ is a TM that halts on } \epsilon \}$

$$H \subseteq A_1$$

$$\langle M \rangle \langle w \rangle \rightarrow \langle M^* \rangle$$

保证映射前后答案一样

$M \text{ halts on } w \Leftrightarrow M^* \text{ halts on } \epsilon$.

我们要构造 M^* 使其满足
 $\forall M^* = \text{on input } u$

1. run M on w

M^* halts on $\epsilon \Leftrightarrow M^*$ halts on some input $\xrightarrow{\text{any}} M$ halts on w

$$f(\langle M \rangle \langle w \rangle) = \langle M^* \rangle$$

② $A_2 = \{ \langle M \rangle : M \text{ is a TM that halts on some inputs.} \}$

$$H \subseteq A_2$$

同 ①

③ $A_3 = \{ \langle M \rangle : M \text{ is a TM that halts on every input} \}$

$$H \subseteq A_3$$

④ $A_4 = \{ "M_1, " "M_2" : M_1 \text{ and } M_2 \text{ are two TMs with } L(M_1) = L(M_2) \}$

Hint: $\vdash A_3 \Rightarrow "M" \rightarrow "M_1, " "M_2"$

M halts on every input ($\Rightarrow L(M_1) = L(M_2)$)

M_2 = on input x

1. halt

Let $M_1 = M$, then M halts on every input ($\Rightarrow L(M) = \Sigma^*$)
 $L(M_1) = L(M_2)$

⑤ $R_{TM} = \{ "M" : M \text{ is a TM with } L(M) \text{ is regular} \}$.

要证 $\overline{R_{TM}} = \{ "M" : M \text{ is a TM with } L(M) \text{ is not regular} \}$ 不可判定

H

$\overline{R_{TM}}$

"M" "w" $\longrightarrow M^*$

M halts on w ($\Rightarrow L(M^*)$ is not regular).

M^* = on input x

1. run M on w

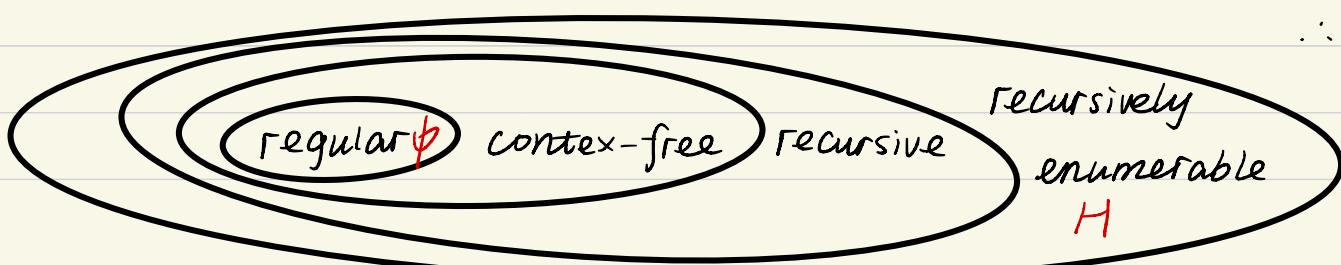
2. run U on x

$L(M^*) = \begin{cases} L(U) & \text{if } M \text{ halts on } w \\ \emptyset & \text{if } M \text{ does not halt on } w. \end{cases}$

$\therefore L(M^*)$ is not regular



M halts on w



6. $CF_{TM} = \{ "M" : M \text{ is a TM with } L(M) \text{ being context-free}\}$

$$H \subseteq \overline{CF_T}$$

$L(M^*)$ is not context-free ($\Rightarrow M$ halts on w).

7. $REC_{TM} = \{ "M" : M \text{ is a TM with } L(M) \text{ being recursive}\}$

$$H \subseteq \overline{REC}_{TM}$$

$A = \{ "M" : M \text{ is a TM that halts on every input}\}$ 判定

$B = \{ "M_1, M_2" : M_1 \text{ and } M_2 \text{ are two TMs with } L(M_1) = L(M_2)\}$

$A \subseteq B$: 用 B 来解决 A : 若有 M_B , 用其构造 M_A

$M_A = \text{on input } "M"$ 判定

1. consider a TM M^* that halts on every input.

2. run M_B on $"M" | M^*$

3. return the result of M_B .

reduction from A to B

判定

$\{ "M" | M \text{ is a TM with } L(M) \text{ having property } P\}$

regular / context-free / recursive / $e \in L(M) / L(M) = \Sigma^*$

\downarrow
 $\Delta(P) = \text{the set of recursively enumerable languages satisfying } P$

$R(P) = \{ "M" | M \text{ is a TM with } L(M) \in \Delta(P)\}$ 不可判定?

if $\Delta(P) = \emptyset$ or the set of all recursively enumerable, $R(P)$ is recursive.

Rice's Theorem: If $\Delta(P)$ is a non-empty proper subset of all recursively enumerable languages,

then $R(P)$ is not recursive.

Proof:

case 1. $\phi \notin \Delta(\text{LP})$. $\exists A \in \Delta(\text{LP})$ 且 $A \neq \emptyset$.

\Downarrow
 $\exists M_A$ semidecides A

要证: $H \leq R(\text{LP})$
 $\begin{array}{c} P \\ \uparrow \\ M_H \\ \uparrow \\ M_R \end{array}$

$M_H =$ on input " m " " w "

1. construct a TM $M^* =$ on input x

(1) run M on w

(2) run M_A on x

2. run M_R on " M^* "

3. return the result of M^*

$\exists \downarrow L(M^*) = \begin{cases} L(M_A) = A, & \text{if } M \text{ halts on } w. \\ \emptyset \notin \Delta(\text{LP}), & \text{if ... not...} \end{cases}$

我们只要知道 $L(M^*) = ? \Rightarrow M$ 是否 halt on w .

case 2: $\phi \in \Delta(\text{LP})$. $\exists \phi \in \overline{\Delta(\text{LP})}$

Summary

proving recursive \leftarrow by def (construct TM)

$A \leq$ a known recursive language

H is not recursive. (Diagonalization)

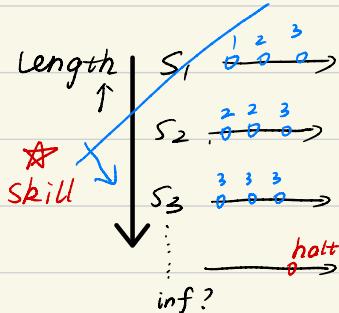
proving non-recursive : A known non-recursive language $\leq A$.

$A \leq$ a known recursively enumerable language

proving recursively enumerable \leftarrow by def

Example

$A = \{ "M" : M \text{ is a TM that halts on some input}\}$ is recursively enumerable.



M halts on S_j at the k -th step $\Rightarrow \max(k, j)$

M_A = on input " M "

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

for $s = s_1, \dots, s_i$

run M on s for i steps

if M halts on s within i steps:

proving not recursively enumerable — A known non-recursively enumerable lang. \leq_A halt theorem.

Theorem: If A and \bar{A} are recursively enum. then A is recursive.
 \uparrow \uparrow
 $M_1 + M_2 \Rightarrow M_3$ (decides A ?)

M_3 = on input x

1. run M_1 and M_2 on x in parallel

2. if M_1 halts

3. accept x

原因: $x \in L(A)$ or $x \in L(\bar{A})$

4. if M_2 halts

5. reject x

Example.

H is recursively enum $\Rightarrow \bar{H}$ is not recursively enum

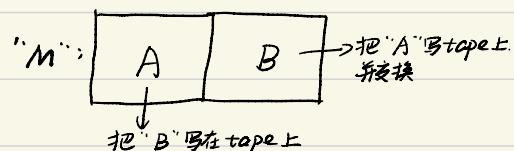
H is not recursive

Closure property

	recursive	recursively enum.
\cup	✓	✓
\cap	✓	✓
-	✓	X
\circ	✓	✓
*	✓	✓

Example. write a program that print itself.

M write "M" on its tape.



A: write "B" on the tape.

B: write "A" on the tape, and swap it with "B"

循环定义?

要让 B 的定义不依赖于 A

function $g(w) = "Mw"$ where Mw is a TM that prints w on its tape

g is computable (\because Given w , Mw = on input x .

1. write w on the tape
2. halt.)

→ 定义不依赖 A, 但根据 A 的输出作为输入 (推出 "A")

- $B := \text{on input } w$ A 的输出
1. compute $q(w)$ $q(w) = "A"$
2. write $q(w) \cdot w$ on its tape
 " " " "

先运行 A $T[B]$ 此时输入是 "B", 再运行 B (写 "A" "B")

Recursion Theorem.

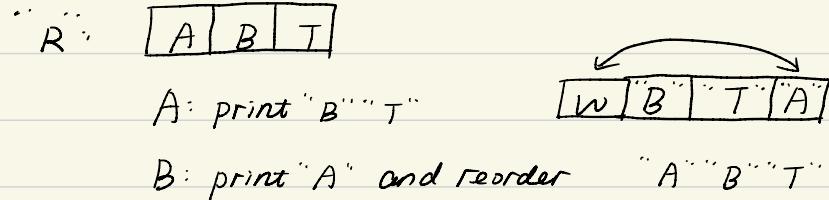
for any TM T, there is a TM R such that for any string w,
the computation of R on w is equivalent to that of T on " R^w ".

↑
R 带到了自己 encoding

作用: M = on input x

1. obtain " M " → Legal (可以在 TM 里有这样操作)

proof sketch.



Example.

可用来自证 H non-recursive. Assume H is recursive, $\exists M_H$ decides H.

R = on input w

拿到自己 code 1. obtain "R"
先用 H 做判定
再反过来 halt 2. run M_H on "R" "w"

3. if M_H accepts "R" "w"
4. looping

5. else M_H rejects "R" "w"
6. halt

→ Contradiction

Enumerator:

We say a TM enumerate a language L , if for some state q ,

从空输入开始. 到 $q \sqcup w$

$$L = \{w : (\text{S}, D \sqsubseteq) \xrightarrow{\text{TM}^*} (q, D \sqsubseteq w)\}$$

↓
output w
/ output state

Turing enumerable

Theorem. A language is L Turing enumerable \Leftrightarrow it is recursively enum.

proof: finite \Rightarrow trivial

Assume L is infinite

$\Rightarrow \exists M$ enumerate L goal: M' semidecides L

M' = on input x .

1. run M to enumerate L
2. every time M outputs a string w
3. if $w = x$:
4. halt

$\Leftarrow \exists M$ semidecides L . goal: M' enumerate L

\therefore 只能半判定 \Rightarrow 可能 loop forever

$S_1 \begin{matrix} 1 \\ 0 \\ 0 \end{matrix} \begin{matrix} 2 \\ 0 \\ 0 \end{matrix} \begin{matrix} 3 \\ 0 \\ 0 \end{matrix}$
 $S_2 \begin{matrix} 2 \\ 0 \\ 0 \end{matrix} \begin{matrix} 2 \\ 0 \\ 0 \end{matrix} \begin{matrix} 3 \\ 0 \\ 0 \end{matrix}$
 $S_3 \begin{matrix} 0 \\ 3 \\ 0 \end{matrix} \begin{matrix} 0 \\ 3 \\ 0 \end{matrix} \begin{matrix} 0 \\ 3 \\ 0 \end{matrix}$

输出 S_i if M halts

同样串可能重复. 乱序输出 ✓

按字典序枚举

Let M be a TM that decides L , we say M Lexicographically enumerates L if whenever $(q, D \sqsubseteq w_1) \xrightarrow{\text{TM}^*} (q, D \sqsubseteq w_2)$, we have w_2 is after w_1 in lexicographical order.

Theorem. L is lexicographically enumerable \Leftrightarrow it is recursive.

证明类似：

$\Rightarrow \exists M$ enumerate L goal: M' decides L

lexicographically M' = on input x .

1. run M to enumerate L → only order $\leq x$
(字典序 $> x \Rightarrow$ reject)
 2. every time M outputs a string w
 3. if $w = x$:
 4. accept.

$\Leftarrow \exists M. \text{ decides } L.$

S_1 —————
 S_2 —————
 S_3 —————
⋮

一行行枚举即可 (decide , 必会停机)

numerical function

$$f: N^k \rightarrow N \quad (k \geq 0)$$

→ computable

A TM M compute $f: \mathbb{N}^k \rightarrow \mathbb{N}$ if for any $n_1, \dots, n_k \in \mathbb{N}$, $M(\text{bin}(n_1), \text{bin}(n_2), \dots, \text{bin}(n_k)) = \text{bin}(f(n_1, n_2, \dots, n_k))$

basic functions

(1) zero function

$$\text{zero}(n_1, n_2, \dots, n_k) = 0 \quad \text{for any } n_1, \dots, n_k$$

(2) identity

$$\text{id}_{k,j}(n_1, \dots, n_k) = n_j$$

(3) successor function

$$\text{succ}(n) = n + 1$$

两种操作：

$$(1) \text{ composition: } g: N \rightarrow N, h: N \rightarrow N \Rightarrow f(x) = g(h(x))$$

$$\text{多元: } g: N^k \rightarrow N, h_1, \dots, h_k: N^l \rightarrow N \Rightarrow f(n_1, \dots, n_l) = g(h_1(n_1, \dots, n_l), h_2(n_1, \dots, n_l), \dots, h_k(n_1, \dots, n_l))$$

↓
composition of g and ...

(2) recursive definition

$$f(n) = n! \stackrel{\text{可用}}{\Rightarrow} \begin{cases} f(0) = 1 & \text{定义} \\ f(n+1) = f(n) \cdot (n+1) = h(f(n), n) \end{cases}$$

$$\text{多元: } g: N^k \rightarrow N, h: N^{k+2} \rightarrow N \Rightarrow f: N^{k+1} \rightarrow N. \begin{cases} f(n_1, \dots, n_k, 0) = g(n_1, \dots, n_k) \\ f(n_1, \dots, n_k, m+1) = h(n_1, \dots, n_k, m, f(n_1, \dots, n_k, m)) \end{cases}$$

前-22页的图

Def: basic functions + $\begin{cases} \text{composition} \\ \text{recursive def} \end{cases} \longrightarrow \text{primitive recursive function}$

Corollary: primitive recursive function + $\begin{cases} \text{composition} \\ \text{recursive def} \end{cases} = \text{primitive recursive functions}$

Example.

$$(1) \text{plus2}(n) = n + 2$$

$$\text{succ}(\text{succ}(n))$$

$$(2) \text{plus}(m, n) = m + n$$

$$\left\{ \begin{array}{l} \text{plus}(m, 0) = m \\ \text{plus}(m, n+1) = \text{succ}(\text{plus}(m, n)) \end{array} \right.$$

严格
应为关于 $m, n, \text{plus}(m, n)$ 递归

$$\text{succ}(\text{id}_{3,3}(m, n, \text{plus}(m, n)))$$

$$(3) \text{mult}(m, n) = m \cdot n$$

$$\left\{ \begin{array}{l} \text{mult}(m, 0) = 0 \quad \text{pr} \Rightarrow \text{pr} \\ \text{mult}(m, n+1) = \text{plus}(\text{mult}(m, n), m) \end{array} \right.$$

$$(4) \text{exp}(m, n) = m^n$$

$$(5) f(n_1, \dots, n_k) = c$$

$$\text{succ}(\text{zero}(n_1, \dots, n_k))$$

从 1 次

$$(6) \text{sgn function}$$

$$\left\{ \begin{array}{l} \text{sgn}(0) = 0 \\ \text{sgn}(n+1) = 1 \quad // h(n, \text{sgn}(n)) = 1 \end{array} \right.$$

$$(7) \text{predecessor function}$$

$$\text{pred}(n) = \begin{cases} n-1 & \text{if } n > 0 \\ 0 & \text{if } n = 0 \end{cases} \Rightarrow \left\{ \begin{array}{l} \text{pred}(0) = 0 \\ \text{pred}(n+1) = n = \text{id}_{2,1}(n, \text{pred}(n)) \end{array} \right.$$

$$(8) m \sim n = \max\{m-n, 0\}$$

$$\begin{cases} m \sim 0 = m \\ m \sim (n+1) = m \sim n - 1 = \text{pred}(m \sim n) \end{cases}$$

$+ - \times \Rightarrow$ primitive recursive

\Downarrow
if f, g are p.r. so are $f+g, f \cdot g, f \cdot g$

$$(9) \underset{\text{sgn}(n)}{\downarrow} \text{positive}(n) = \begin{cases} 1 & \text{if } n > 0 \\ 0 & \text{if } n = 0 \end{cases}$$

$$(10) \underset{1 - \text{positive}(n)}{\downarrow} \text{iszero}(n) = \begin{cases} 0 & \text{if } n > 0 \\ 1 & \text{if } n = 0 \end{cases}$$

| predicates

If two predicates p and q are p.r., so are $\neg p, p \wedge q, p \vee q$.

$$\therefore \neg p = 1 - p, p \wedge q = p \cdot q, p \vee q = \text{positive}(p + q)$$

$$(11) \underset{\text{iszero}(n \sim m)}{\downarrow} \text{geq}(m, n) = \begin{cases} 1 & \text{if } m \geq n \\ 0 & \text{if } m < n \end{cases}$$

substraction

$$(12) \text{eq}(m, n) = \begin{cases} 1 & \text{if } m = n \\ 0 & \text{if } m \neq n \end{cases} \quad \text{geq}(m, n) \wedge \text{geq}(n, m)$$

$$f(n_1, \dots, n_k) = \begin{cases} g(n_1, \dots, n_k) & \text{if } p(n_1, \dots, n_k) \\ h(n_1, \dots, n_k) & \text{otherwise} \end{cases}$$

If g, h, p are p.r. so is f . ($f = p \cdot g + (1-p) \cdot h$)

$$(13) \text{rem}(m, n) = m \% n$$

$$\begin{cases} \text{rem}(0, n) = n \\ \text{rem}(m+1, n) = \begin{cases} 0 & \text{if } m+1 \text{ is divisible by } n (\Rightarrow \text{eq}(\text{rem}(m, n), \text{pred}(n))) \\ \text{rem}(m, n) + 1 & \text{otherwise} \end{cases} \end{cases}$$

$$(14) \text{div}(m, n) = L^m / n \perp \text{ if } n \neq 0$$

$$\begin{cases} \text{div}(0, n) = 0 \\ \text{div}(m+1, n) = \begin{cases} \text{div}(m, n) + 1 & \text{if } m+1 \text{ is divisible by } n \\ \text{div}(m, n) & \text{otherwise} \end{cases} \end{cases}$$

$$(15) \text{digit}(m, n, p) = a_{m-1}$$

$$n = a_k p^k + \dots + a_{m-1} p^{m-1}, a_1, p^1 + a_0 \quad \text{将 } n \text{ 用 } p \text{ 进制表示, 返回第 } m \text{ 位}$$

$$\text{div}(\text{rem}(n, p^m), p^{m-1})$$

(16) P : primitive recursive predicates

bounded disjunction. $g_p(n) = \begin{cases} 1 & \text{if } \exists 1 \leq i \leq n, p(i) = 1 \\ 0 & \text{otherwise} \end{cases}$

$\downarrow n$ 中是否有 i 使 p 为真

g_p 也是 P.R.

$$\begin{aligned} g_p(n) &= p(0) \cup \dots \cup p(n) \\ &= \text{positive}(\text{sum}_p(n)) \end{aligned}$$

bounded conjunction $h_p(n) = \begin{cases} 1 & \text{if } \forall 1 \leq i \leq n, p(i) = 1 \\ 0 & \text{otherwise} \end{cases}$

$\downarrow n$ 中是否 $\forall i$ 使 p 为真

$$(17) \text{sumf}(m, n) = \sum_{k=0}^n f(m, k)$$

可证: if f is P.R., so is sumf .

$$\text{sumf}(m, n) = f(m, 0) + \dots + f(m, n) \quad \text{if sum of } \downarrow n \text{ P.R. func?} \quad \times$$

n 不是一个常数!

$$\begin{cases} \text{sumf}(m, 0) = f(m, 0) \\ \text{sumf}(m, n+1) = \text{sumf}(m, n) + f(m, \text{succ}(n)) \end{cases}$$

$$\text{mult}_p(m, n) = \prod_{k=0}^n f(m, k) \Rightarrow h_p(n) \text{ is also P.R.}$$

Lemma. All p.r. func. are computable.

proof: basic functions are computable, | composition
recursive def preserve computability.

Ex: All computable func. are primitive recursive? \times

all p.r. func \Rightarrow expression

↓
enumerate all the expression

↓
enumerate all unary p.r. func. $g_1, g_2 \dots g_n$

? Computable

M = on input n

1. enumerate $g_1, g_2 \dots$ to get g_n
2. compute $g_n(n)$
3. return $g_n(n)+1$

g^* is not p.r. \leftarrow Compute g^* , if $g^* \neq g_n \forall n$

$$(\because g^*(n) = g_n(n)+1 \neq g_n(n))$$

basic functions +

composition

recursive def

minimalization of minimalizable functions

min~~pose~~

$g(n_1, \dots, n_k, n_k+1)$

μ -recursive \Leftrightarrow Computable

$$f(n_1, \dots, n_k) = \begin{cases} \text{minimum } m \text{ with } g(n_1, \dots, n_k, m) = 1 & \text{if exists} \\ 0 & \text{otherwise} \end{cases}$$

f is a minimalization of g , $\mu m [g(n_1, \dots, n_k, m) = 1]$

Example :

$$\text{Log}(m, n) = \Gamma \log_{m+2}(n+1) \Gamma \quad // \min \{ p : (m+2)^p \geq n+1 \}$$

g

$$``\text{up}[\text{geq}((m+2)^p, n+1) = 1]"$$

A function g is minimalizable if

(1) g is computable

(2) for $\forall n_1 \dots n_k, \exists m \geq 0$ s.t. $g(n_1, n_2, \dots, n_k, m) = 1$

一个式子总会停机.

Minimalization of g is computable if g is minimalizable.

Given a computable function g , is g minimalizable? \rightarrow undecidable

μ -Recursive = basic functions + { composition
recursively def.
minimalization of minimalizable functions }

Theorem: A numerical function f is μ -recursive \Leftrightarrow it is computable.

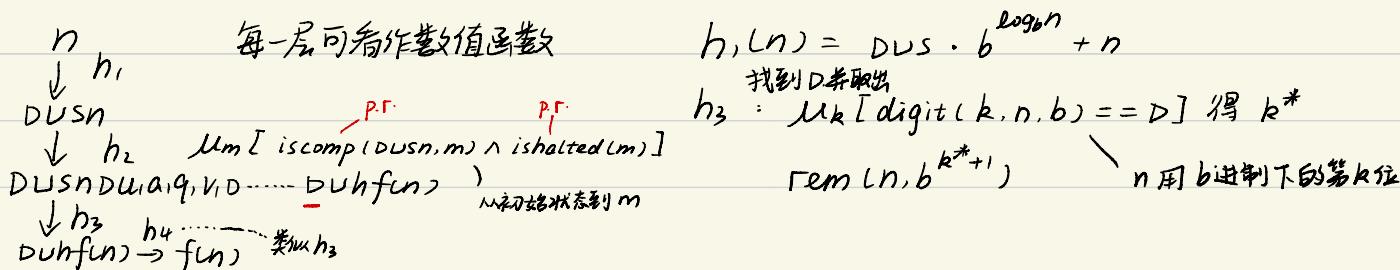
Proof: \Rightarrow trivial

$\Leftarrow f: \exists M \text{ computes } f. (\underline{S}, \underline{D}, \underline{U}, \underline{N}) \Gamma_m (q_1, \underline{D}, \underline{U}, \underline{a}, \underline{v}_1) \dots \Gamma_m (b, \underline{D}, \underline{U}, \underline{f}, \underline{n})$

可写作:

$\underline{D}, \underline{U}, \underline{S}, \underline{N}, \underline{U}, \underline{a}, q, \underline{v}, D, \dots, \underline{D}, \underline{U}, \underline{f}, \underline{n}$ 可以表示为一个数 (base-b integer)

$\Sigma U \rightarrow \{0, \dots, b-1\}$ ($b = |\Sigma U|$)



Grammar (Conrestriced grammar)

CFG: $A \rightarrow u, B \rightarrow v, \dots$ 可以与上下文有关 e.g. $uAv \rightarrow w$

Def. A grammar is a 4-tuple $G = (V, \Sigma, S, R)$

- V is an alphabet
- $\Sigma \subseteq V$ is the set of terminals
- $S \in V - \Sigma$: start symbol
- R : a finite set of $(\underline{V^*} (\underline{V - \Sigma}) \underline{V^*}) \times V^*$
context
nonterminal

$\Rightarrow_G, \Rightarrow_G^*$ G generates a string $w \in \Sigma^*$ if $S \Rightarrow_G^* w$. $L(G) = \{w \in \Sigma^* : G \text{ generates } w\}$

Example.

$\{a^n b^n c^n : n \geq 0\}$

$S \rightarrow ABCS \quad ABCABC\dots$

$BA \rightarrow AB, CA \rightarrow AC, CB \rightarrow BC \quad A \dots AB \dots BC \dots CS$

$S \rightarrow T_c \quad CT_c \rightarrow T_c C \quad BT_c \rightarrow BT_b \quad \text{从右往左扫}$

$BT_b \rightarrow T_b b \quad AT_b \rightarrow AT_a$

$AT_a \rightarrow T_a a \quad T_a \rightarrow \epsilon$

Theorem. A language is generated by some grammar \Leftrightarrow it is semidecided by some TM.

Proof. $G \Rightarrow \text{TM } M$ to semidecides $L(G)$.

given $w \in \Sigma^*$, is $S \Rightarrow_G^* w$? (第*i*步有 $|R|$ 种. 若找到 $\Rightarrow \text{halt}$)



\Leftarrow Given M . construct G to generate $L(M)$ ($S \Rightarrow_G^* w \Leftrightarrow w \in L(M)$)

$\exists f: w \in L(M) : (S, D \underline{U} W) \xrightarrow{f} (q_1, D \underline{U}, q_1, V_1) \dots \xrightarrow{f} (q_h, D \underline{U} h)$

$D \underline{U} S W \xrightarrow{\text{规}} (q_1, D \underline{U}, q_1, V_1) \dots \xrightarrow{\text{规}} (q_h, D \underline{U} h)$
 用 state 标记下划线位置

$$S \Rightarrow Duha \Rightarrow \dots \Rightarrow Du, a, q, V, \Delta \Rightarrow DuSw \Rightarrow w$$

① $S \rightarrow Duha$? ③
② $DuS \rightarrow e$

④

写: if $\delta(q, a) = (p, b)$ for some $a, b \in \Sigma$

$$uaqV \Delta \quad Tm \quad ubpV \Delta \quad bp \rightarrow aq$$

右移: if $\delta(q, a) = (p, \rightarrow)$

$$uaqbV \Delta \quad Tm \quad uabpV \Delta \quad abp \rightarrow aqb \text{ for } b \in \Sigma$$

若 b, V 为空格 if $b = \sqcup, V = e$ $uaq \Delta \Rightarrow uaup \Delta \quad aup \rightarrow aq$

左移

...

$$\therefore L(G) = L(M)$$

复杂度

decidable vs. undecidable

resource: time, space

$$A = \{0^k 1^k : k \geq 0\} \quad \text{Given } w, w \in A ? \quad n = |w|$$

要走多少步

用单带TM情况下 扫 $\frac{n}{2}$ 次, 每次走 $O(n)$ 步 $\Rightarrow O(n^2)$ 每次扫消一个 $0+1$

$$\boxed{00 \ 00 \times \times 11} \quad \log n \cdot O(n) = O(n \log n) \quad \text{每次扫消掉一半 } 0 \text{ 和 } 1 (\text{隔一格消})$$

Def: Let M be a deterministic TM that halts on every input. The running time of M is a function $f: N \rightarrow N$ where for any input of length n , M halts within $f(n)$ steps

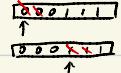
最坏情况. n

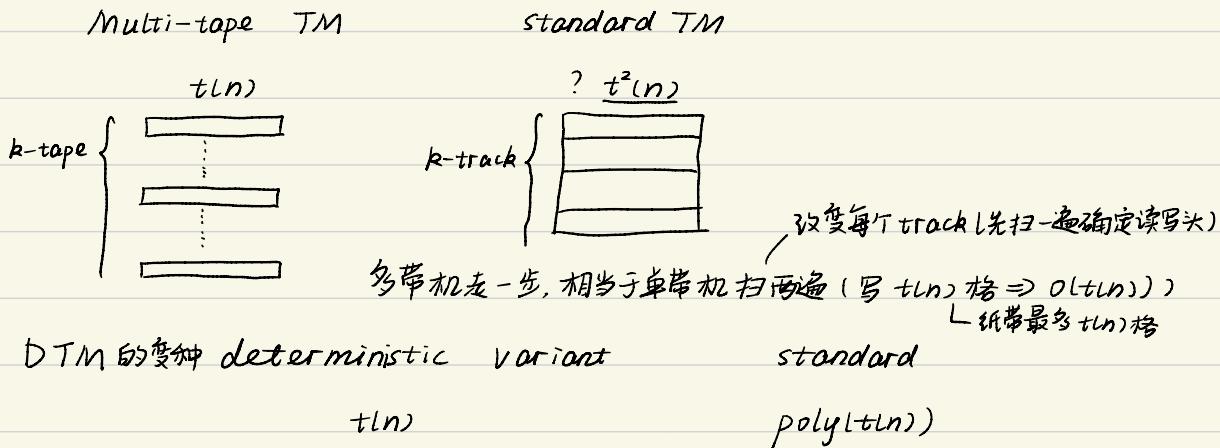
input length #step

$\text{DTIME}(t(n)) = \{A : A \text{ is decided by some standard TM within } O(t(n)) \text{ running time.}\}$

$$A = \{0^k 1^k : k \geq 0\} \quad 2\text{-tape: } O(N)$$

依赖于特定TM(单带)





Cobham - Edmonds Thesis:

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

复杂类 P is the set of languages that are decided by some deterministic TM whose running time is $\text{poly}(n)$.

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

Theorem: Every context-free language is in P .

proof: for any context-free language A , $\exists \text{CFG } G = (V, \Sigma, S, R)$ in CNF generates A .

Given w , enumerate all derivations of length $2|w|-1$. $R^{2|w|-1}$ 可判定, 但无法证明多项式时间

可以用 DP: Dynamical Programming $w = a_1 \dots a_n, S \Rightarrow^* w?$

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

可以生成子串的 nonterminals 的集合.

subproblem: 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: $S \in T[1, n]?$

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

recurrence: $1 \leq i < j \leq n$: $T[i, j] = \bigcup_{k=i}^{j-1} \{A \Rightarrow BC : B \Rightarrow^* a_i \dots a_k \wedge C \Rightarrow^* a_{k+1} \dots a_j\}$

$$\frac{a_i a_{i+1} \dots a_k}{B} \frac{a_{k+1} \dots a_j}{C} \text{ 且 } A \Rightarrow BC$$

subproblems: $\frac{n!}{2}$

cost per subproblem: $n \cdot |R|$

total: $O(n^3|R|)$

与输入无关,
是规则数

$$f(s) = |s|$$

M = on input F (boolean formula)

1. non-deterministically generate an assignment of boolean variable.

2. If F is satisfied, accept.

3. otherwise reject.

SAT $\in P$? unknown

satisfiability

$$(x_1 \vee x_2 \vee x_3) \wedge (x_2 \vee \bar{x}_3 \vee x_4) \wedge (x_1 \vee x_2 \vee x_4 \vee x_5)$$

用NTM可以在多项式时间内

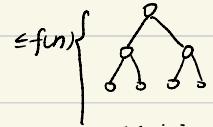
每分支都停机

Def. Let M be a non-deterministic TM that for any input every branch of M halts with k steps where k depends only on the input.

The running time of M is a function $f: N \rightarrow N$ such that for any input of length n , every branch of M

halts with $f(n)$ steps.
 $|w|=n$

NP is the set of all languages that can be decided by some NTMs in polynomial time.
(non-deterministically polynomial)



(1) for any F that is satisfiable, \exists certificate y , 在 y 的帮助下验证 F

evaluate F under y if F is satisfied, accept.

Def: A language A is poly verifiable if there is a polynomial-time DTM V such that for any $x \in \Sigma^*$,

(1) if $x \in A$, $\exists y$ with $|y| \leq \text{poly}(|x|)$, V accept " $x" "y$ "

verifier

(2) if $x \notin A$, $\forall y$ rejects

Example. $A = \text{SAT}$, $x = \text{boolean formula}$, $y = \text{a truth assignment that satisfies } x$.

V = on input " $x" "y$ "

1. evaluate x under y

2. if x is satisfied by y
accepts " $x" "y$ "

3. else

rejects " $x" "y$ "

Theorem: A language A is polynomially verifiable \Leftrightarrow it is in NP.

Proof: $\Rightarrow \exists$ polynomial-time verifier V

to construct a NTM M decides A in polynomial time.

M = on input x

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

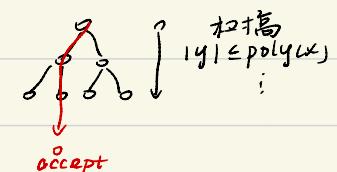
$\Leftarrow \exists$ NTM M decides A in poly time.

to construct poly-time verifier V for A .

Certificate y = the branch that accepts x 每个分支如何选择

V = on input " x " " y "

1. run M on x deterministically under guidance of y
2. if M accepts x
 accept " x " " y "
3. else
 reject " x " " y "



P. vs NP.

$P = NP?$ unknown

直觉上:
 $P \neq NP$

($P \subseteq NP$)

a NTM is a DTM

$A \in P$: DTM D , 这样不需要 certificate

V = on input " x " " y "
1. run D on x

Cook & Levin:

an NP-complete problem is in $P \Leftrightarrow P = NP$

NP - Complete : hardest in NP

a reduction f from A to B (i.e. $A \leq B$)

+

f can be computed by some DTM in poly(n) time.

↓

$A \leq_p B$ "A在多项式时间内可被归约到B".

用来判断难度

Theorem. If $A \leq_p B$, $B \in P$ then $A \in P$

$x \rightarrow f(x) \rightarrow \text{decide } f(x) \in B?$

$\text{poly}(x) + \text{poly}(f(x))$ and $|f(x)| \leq \text{poly}(|x|)$

└写输出的长度

Example

SAT $(x_1 \vee x_2 \vee x_3 \dots) \wedge (x_1 \vee x_2) \wedge \dots$

3SAT $(x_1 \vee x_2 \vee \bar{x}_3) \wedge (x_2 \vee x_4 \vee x_5) \wedge \dots$

$3SAT \leq_p SAT \quad f(x) = x$

$SAT \leq_p 3SAT$

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

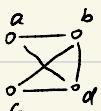
$(x_1 \vee x_2 \vee x_3 \vee x_4 \vee x_5) \Rightarrow (\underline{x_1 \vee x_2 \vee y}) \wedge (\underline{x_3 \vee x_4 \vee x_5 \vee \bar{y}}) \Rightarrow \dots$

$3 \cdot (k-2) = O(k)$
└括号内长度

Clique

图问题

$$G = (V, E)$$



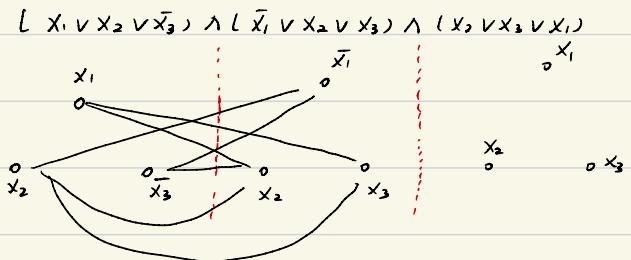
A clique of G is a subset $V' \subseteq V$ such that for any $u, v \in V'$ and $u \neq v$, $(u, v) \in E$

e.g. $\{a, b\} \vee \{a, b, d\} \vee \{a, b, c, d\} \times$

CLIQUE = { $"G"$ " k ": G has a clique of at least k }

要证: $3-SAT \leq_p CLIQUE$

$F \Rightarrow G \quad k$



m clauses

then $k = m$

要证: F is satisfiable $\Leftrightarrow G$ has a clique of size at least m .

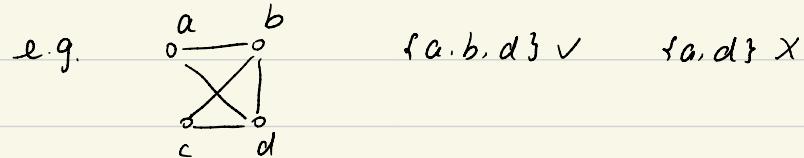
$\Rightarrow \checkmark$

\Leftarrow 团至多包含一个组中的一个点 $\Rightarrow k$ 个点的团中 k 个组均有点选中

$$G: \# \text{nodes} : 3m, \# \text{edges} : \leq 9m^2$$

Vertex Cover

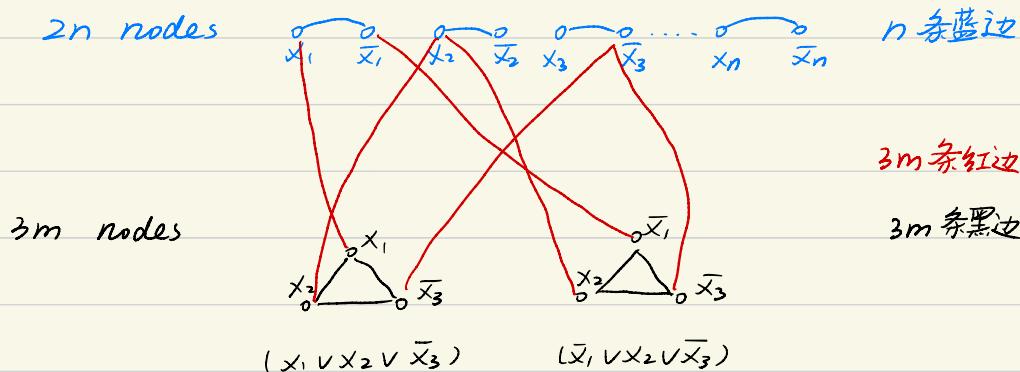
$G = (V, E)$ A vertex cover of G is a subset $V' \subseteq V$ s.t. for any $e \in E$, e has at least one endpoint in V' .



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

要证: 3-SAT $\leq_p VC$

$F(n \text{ variables}, m \text{ clauses}) \Rightarrow "G" "k"$



F is satisfiable $\Leftrightarrow G$ has a vertex cover of size $n+2m$

$\Rightarrow ?$

\Leftarrow

G : # nodes: $2n+3m$
 $\leq 6m \cdot n$
edges: $n+3m + \frac{3}{2}n$

Def. A language L is NP-complete if

(1) $L \in NP$

(2) $\forall L' \in NP, L' \leq_p L$

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

Proof: Let A be an arbitrary language in NP.

$$A \leq_p SAT$$

$$x \longrightarrow F$$

$x \in A \Leftrightarrow F$ is satisfiable

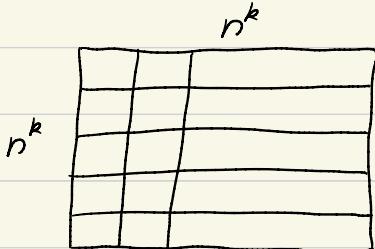
$\exists NTM N$ decides A in n^k time. $a_1, \dots, a_n \in A$.

$\Leftrightarrow \exists (S, D \cup Q, \dots, a_n) T_m (q_1, D_U, Q, V_1) T_m \dots T_m (y, D_U, V)$

$\Leftrightarrow \exists \underbrace{D_U a_1, \dots, a_n}_{\in n^k \text{ configurations of length } n^k}, \underbrace{T_m D_U q_1, V_1, T_m \dots, T_m D_U y, V}_{T_m \dots T_m}$

$\in n^k$ configurations of length n^k .

?



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

x_{ijc} for each i and j $\sum_{c \in \Sigma} x_{ijc} \geq 1 \Leftrightarrow \bigvee_{c \in \Sigma} x_{ijc}$

for each i and j . $\bigwedge_{c \neq c'} x_{ijc} \wedge \overline{x_{ijc'}} = \bigwedge_{c \neq c'} (\overline{x_{ijc}} \vee \overline{x_{ijc'}})$ - 一格只能至多放一个symbol

~~让这个东西~~ $x_{110} = 1 \wedge x_{120} = 1 \wedge x_{130} = 1 \wedge \dots$

要保证行按顺序(第2行接着第1行操作)

C ₁	C ₂	C ₃
C ₁	G	C ₃

C ₁	C ₂	C ₃
Q	G	C ₃

C ₁	Q	C ₃
C ₁	P	G

...

$$\#\text{legal } 2 \times 3 \text{ rectangle} \leq 1K \cup \Sigma^6$$

Theorem: If A is NP-complete, and

i) $B \in \text{NP}$

ii) $A \leq_p B$

then B is NP-complete.

Proof: $\forall L' \in \text{NP}. L \leq_p A \wedge A \leq_p B \Rightarrow L \leq_p B$ 归约传递性.

空间: Let M be a DTM. We say that M runs in $f(n)$ space if for input of length " n "
M uses at most $f(n)$ tape cells.

假定 $f(n) \geq n$

one-tape DTM (实际上变种 TM 只相差一个常数)

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

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

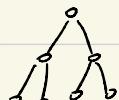
$\text{NPSPACE} = \{A \mid \dots \text{NTM} \dots\}$

$P \subseteq \text{PSPACE}$

If a DTM runs in $f(n)$ time ($f(n) \geq n$)

then it runs in $f(n)$ space. "走这么多格"

$NP \subseteq \text{NPSPACE}$



$\text{poly}(n)$ 空间可以复用, 只用考虑某一分支的空间 $\Rightarrow \text{poly}(n)$

还要记分支的选择情况 (每个结点一个) $\Rightarrow \text{poly}(n)$

If a DTM runs in fun space and it halts on all inputs,
 then it runs in $|K| \text{fun} / \Sigma^{\text{fun}}$ time.

\Rightarrow configuration 不会重 (否则有 loop)
 ↓
 最多步数取决定 configuration 个数
 |
 状态 $|K|$
 位置 fun
 纸带上写的 $|\Sigma|^{\text{fun}}$

$\Rightarrow \text{PSPACE} \subseteq \text{EXP} = \{A \mid A \text{ can be decided by some DTM in } 2^{\text{poly}(\text{fun})} \text{ time}\}$

$P \subseteq NP \subseteq PSPACE \subseteq EXP$ $NPSPACE?$

？? ?? ?? unknown \Rightarrow 但可以证明 $P \not\subseteq EXP$. 则必有一个真包含。

Theorem: $NPSPACE = PSPACE$

Savitch's theorem: If A is decided by some NTM in fun space where $\text{fun} \geq n$,
 then it is decided by some DTM in $O(\text{fun})$ space.

错误证明: 要证每一步的选择 $\text{fun} + C^{\text{fun}}$ total space
 通过

proof: $C_{\text{init}} \xrightarrow{} C_{\text{accept}}$, // all configurations use fun space.

\Downarrow within 2^{fun} steps

$\exists C'$, $C_{\text{init}} \xrightarrow{} C'$ within $2^{\text{fun}-1}$ steps

未知,
 但 2^{fun} choices
 放弃 (对空间)
 \Downarrow

$C' \xrightarrow{} C_{\text{accept}}$ within $2^{\text{fun}-1}$ steps.

$\gamma = \text{on input } C_1, C_2, t$

只用 C_1, C_2

1. if $t == 1$

$S(1) = O(\text{fun})$

2. if $C_1 == C_2$ or $C_1 \neq C_2$

3. accept

4. else
 5. reject

→ Line 7.8 可以重用

$$S(t) = O(f(n)) + S\left(\frac{t}{2}\right)$$
$$\Rightarrow S(t) = O(f(n) \cdot \log t)$$

6. for all configurations c' using $\leq f(n)$ space
7. run γ on $C, C', \frac{t}{2}$
8. run γ on $C', C_2, \frac{t}{2}$
9. If both accept,
10. accept.
11. reject

Run γ on $C_{init}, C_{accept}, 2^{f(n)}$

$$O(f(n) \cdot \log^{f(n)}) = O(f^2(n))$$

Hierarchy Theorem

space : for any $f: N \rightarrow N$ (satisfying technical conditions)

there is a language A such that

其他
即空间↑，就可以判定语言

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

(2) A cannot ... 不能被决定 $O(f(n))$ space

Proof: construct a DTM D

(1) D decides some languages A in $O(f(n))$ space

(2) for any DTM M that runs in $O(f(n))$ space,

D and M differs on at least one input.

$O(f(n))$ space TM :

M_1 "M₁" "M₂" "M₃"
 M_1 1 会停机且 space < f(n)

M_2 -1

M_3

D -1 +1 -1

可以保证性质2.

D = on input " M "

1. Let $n = |"M"|$ technical conditions:
 $f(n)$ can be computed in $\mathcal{O}(f(n))$ space.

$\mathcal{O}(f(n))$ 2. compute $f(n)$

3. run M on " M " for $c^{f(n)}$ steps 不保证停机

3.1 if M does not halt in $c^{f(n)}$ steps, reject
 $f(n)$? 3.2 if M ever uses more than $f(n)$ space, reject

4. if M accept " M " 不在 $\mathcal{O}(f(n))$ 表中

5. reject

6. if M reject " M "

7. accept

TIME.

for any $f: N \rightarrow N$ satisfying some technical conditions,

there is a language A such that

(1) A can be decided by some DTM in $\mathcal{O}(f(n))$ time.

较弱时间要提高 $\log f(n)$
才能有用

(2) cannot $\dots \dots \dots \dots \dots$ $\mathcal{O}(\frac{f(n)}{\log f(n)})$ time

proof: D (1) decides some language A in $\mathcal{O}(f(n))$ time

(2) for any DTM M that runs in $\mathcal{O}(\frac{f(n)}{\log f(n)})$ time

D and M differs on
at least one step (" M ")

D = on input " M "

1. Let $n = |"M"|$ technical condition:
 $f(n)$ can be computed in $\mathcal{O}(f(n))$ time.

2. compute $f(n)$

3. run M on " M " for $\frac{f(n)}{\log f(n)}$ steps

4. if ...

要维持一个 counter: 最后有 $\log f(n)$.

每次 +1 需要 $\log f(n)$ steps
 $\# \text{steps} : \log f(n) : \frac{f(n)}{\log f(n)} = f(n)$

$\Rightarrow P \not\subseteq EXP$ (由上定理可知)