

作业题的扩展(历年卷x)

讨论 20% . 测验 20% . 期末 60% . 作业 0%

## Lec 01

3. hardness complexity class  $\rightarrow$  complexity theory 复杂性理论

为了研究复杂度

1. definitions of problem & computing model  $\rightarrow$  automata theory

( finite automata  
pushdown automata  
Turing machines )

church-Turing Thesis: 图灵机是经典计算模型

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

这个问题由这个 set 决定

Given a string  $w$ ,  $w \in \{\text{encodings of yes-instances}\}$ ?

↓  
a language (所有判定问题可以抽象为一个 yes-instance 的集合)

$\Sigma$

An alphabet is a finite set of symbols.

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

$= \{0, \square, \times\}$

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

A string over  $\Sigma$  is a finite sequence of symbols from  $\Sigma$

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

Length  $|w| = \underset{\text{number of}}{\# \text{ symbols in } w}$

empty string:  $\epsilon$  with  $|\epsilon| = 0$

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

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

$\Sigma^* = \bigcup_{i=0} \Sigma^i$

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



## concatenation

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

## exponentiation

$w^i = \underbrace{w \dots w}_{i \text{ times}}$  e.g.  $w = 01$ ,  $w^0 = \epsilon$ ,  $w^2 = 0101$

## reversal

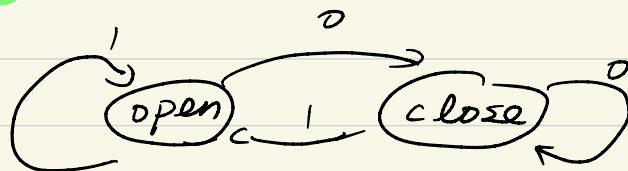
$w = a_1 \dots a_i$ ,  $w^R = a_i \dots a_1$

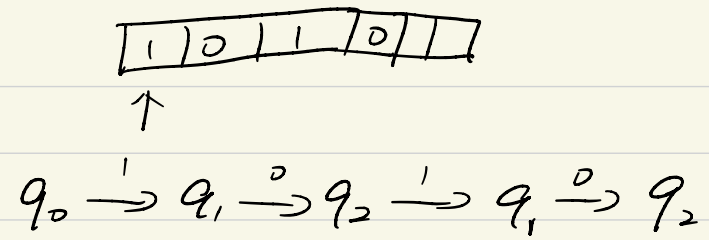
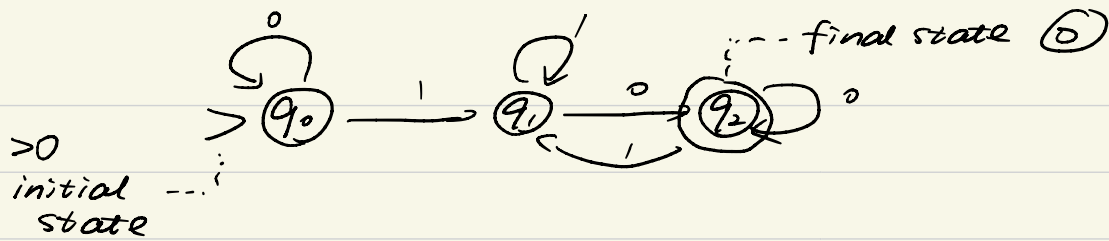
Any subset of  $\Sigma^*$  is a language over  $\Sigma$ .

decision problems  $\Leftrightarrow$  languages

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

## finite automata



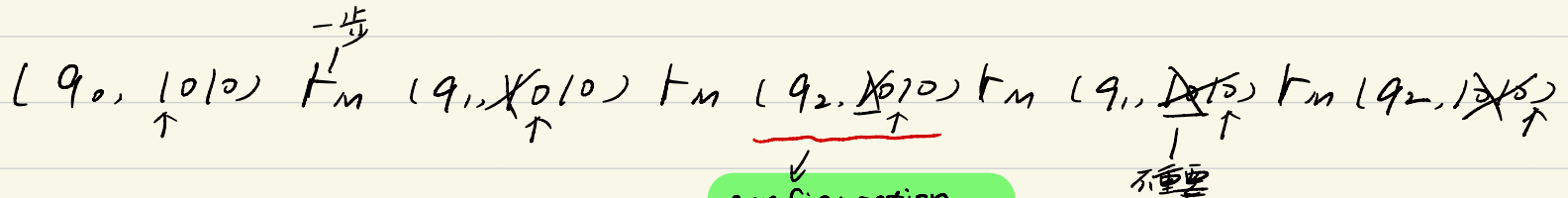


A finite automata  $M = (K, \Sigma, \delta, s, F)$

- $\Sigma$ : input alphabet 纸带上的字符
- $K$ : set of state
- $s \in K$ : initial state 唯一
- $F \subseteq K$ : the set of final states 可以为空, 可以多个

transition functions  $\delta: K \times \Sigma \rightarrow K$   
current state    symbol    next state

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



an element of  $K \times \Sigma^*$   
current state    unread input

$(q, w) \vdash_M (q', w')$  if  $w = aw'$  for some  $a \in \Sigma$  走一步

$\delta(q, a) = q'$   
 $\vdash_M^*$  yields if  $(q, w) = (q', w')$  or 走若干步  
 $(q, w) \vdash_M \dots \vdash_M (q', w')$

$M$  accepts  $w \in \Sigma^*$  if  $(s, w) \vdash_M^* (q, \epsilon)$  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

对象是 language,  $M$  accepts  $L \Leftrightarrow \forall w \in L, M$  accepts  $w$

每一台  $M$  accepts 的  $L$  有且仅有一个  
( $L(M)$  子集也不行)

$\forall w \in L, M$  does not accept  $w$ .

### Exercise



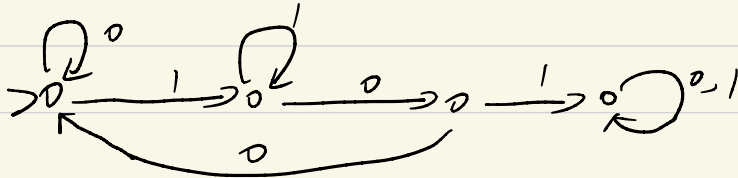
没有 final state  $\Rightarrow L(M) = \emptyset$  (f.e.  $\times$ )



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

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

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



封闭的. 操作后仍是 regular

# Regular Operations

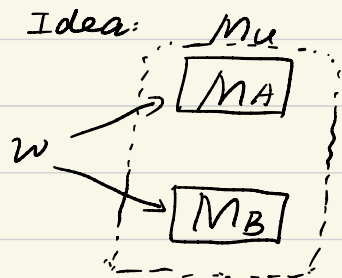
**Union.**  $A \cup B = \{w : w \in A \text{ or } w \in B\}$

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

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

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

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



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

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

$K_u = K_A \times K_B$  ..... 并行, 同时跑

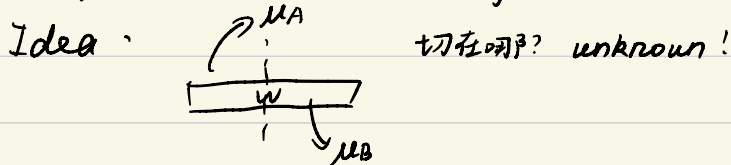
$s_u = (s_A, s_B)$

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

$\delta_u$ : for any  $q_A \in K_A, q_B \in K_B, \text{ any } a \in \Sigma$

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

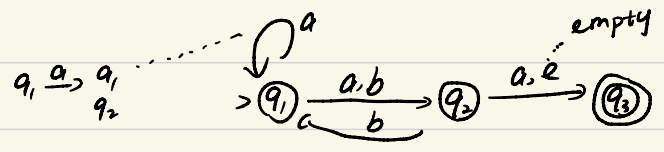
**Theorem:** if  $A$  and  $B$  are regular, so is  $A \circ B$ .



# Non-determinism 非确定性

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

## non-... (NFA)



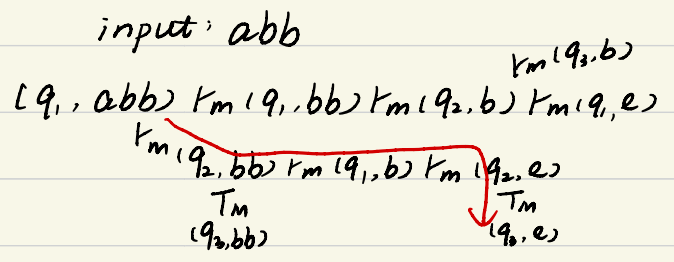
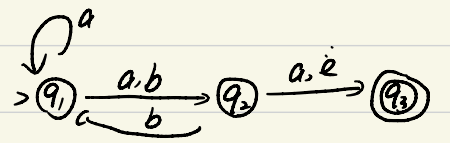
- several choices for next state
- $\epsilon$ -transition 不读字符也能改变状态

$\Delta = \{ (q_1, a, q_1), (q_1, a, q_2), \dots, (q_2, \epsilon, q_3) \}$  a relation  
 三元tuple

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

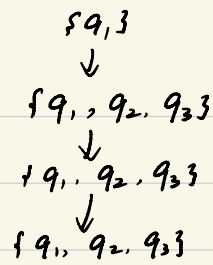
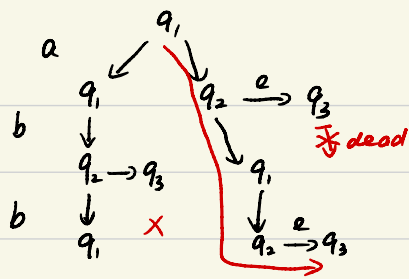
configuration  $(q, w) \in K \times \Sigma^*$   
 $K_m$   $K_m^*$

## Example



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





把一层看作一个点，模拟每一层的变化

$$NFA \quad M = (K, \Sigma, \Delta, s, F)$$

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

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

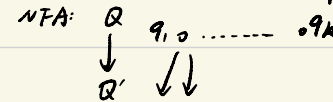
$$F' = \{Q \subseteq K : Q \cap F \neq \emptyset\}$$

$$s' = \{s\} \quad E(s) \quad (\text{可能有: } s \xrightarrow{a} q_1 \xrightarrow{a} q_2)$$

从q出发，不读symbol情况能到的点

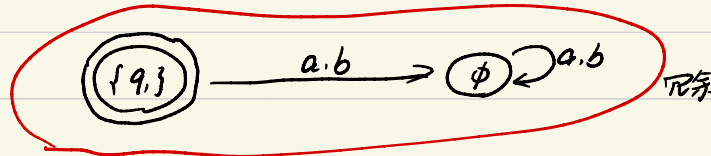
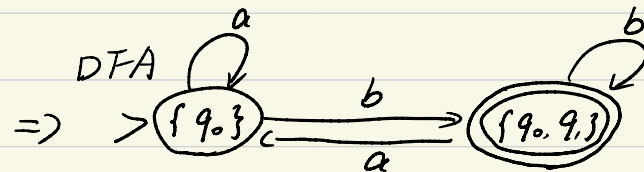
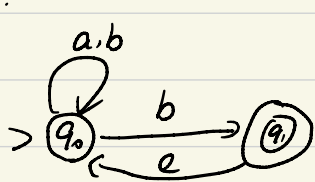
$$\forall q \in K, E(q) = \{p \in K : (q, \epsilon)^+ \vdash (p, \epsilon)\}$$

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



## Example

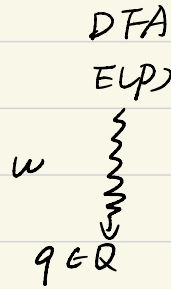
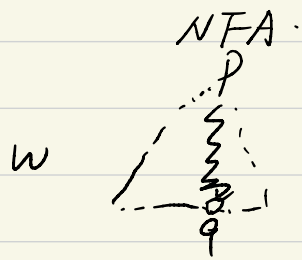
NFA:



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

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

$(p, w) \vdash_M^* (q, \epsilon)$  iff  $(E(p), w) \vdash_{M'}^* (Q, \epsilon)$  for  $q \in Q$ .



by induction on length of  $w$   $\rightarrow$  定义

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

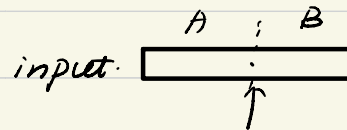
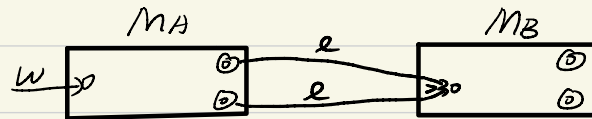
$\Leftrightarrow (E(s), w) \vdash_{M'}^* (Q, \epsilon)$  with  $Q \ni q$  ( $Q \cap F \neq \emptyset$ ,  $Q \in F'$ )

$\Leftrightarrow M'$  accepts  $w$ .

Corollary: regular  $\Leftrightarrow \exists$  NFA

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

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





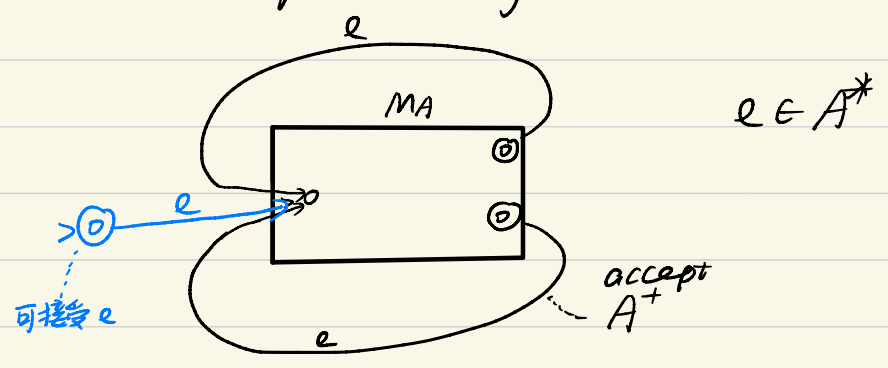
$$M_A = (K_A, \Sigma, \Delta_A, S_A, F_A)$$

$$M_B = (K_B, \Sigma, \Delta_B, S_B, F_B) \Rightarrow M^0 = (K^0, \Sigma, \Delta^0, S^0, F^0)$$

$$R1) K^0 = K_A \cup K_B \quad S^0 = S_A \quad F^0 = F_B$$

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

Theorem: if A is regular, so is A\*



$$q \in A^*$$

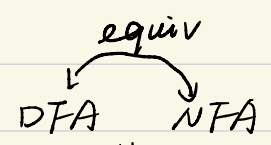
$$M_A = (K_A, \Sigma, \Delta_A, S_A, F_A)$$

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

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

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

$$\Delta^* = \Delta_A \cup \{(q, \epsilon, S_A) : q \in F_A\} \cup \{(S^*, \epsilon, S_A)\} \quad \checkmark \text{构造写出即可}$$



regular languages

closure property  
 $\cup, \cap, *, \neg$

## Regular Expression (REX)

表达式  $R = (a \cup b)^* a$   
 $L(R) = (\{a\} \cup \{b\})^* \cdot \{a\}$  以 a 结尾的 ab\*

Atomic symbol

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

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

composite U. o. \*

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

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

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

Precedence :  $* > \circ > \cup$

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

Example. language 表达式  
 $\{ \epsilon \} \quad \phi^*$

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

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

Theorem: A language A is regular ( $\Leftrightarrow$ ) there is some REX R with  $L(R) = A$

(只需证.  $NFA \Leftrightarrow REX$ )

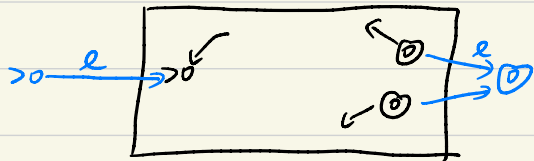
$$L(M) = L(R) \quad \begin{matrix} M & \xrightarrow{L} & R \\ \text{NFA} & \xrightarrow{\text{REX}} & \end{matrix}$$

$R \rightarrow \text{NFA } M$

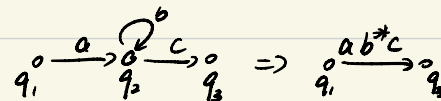
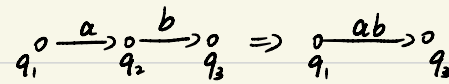
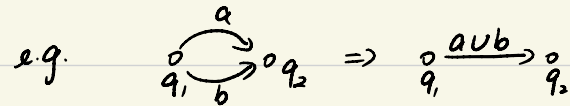
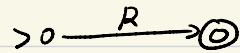
$\text{NFA } M \rightarrow \text{REG } R \text{ s.t. } L(R) = L(M)$

(1) simplify  $M$

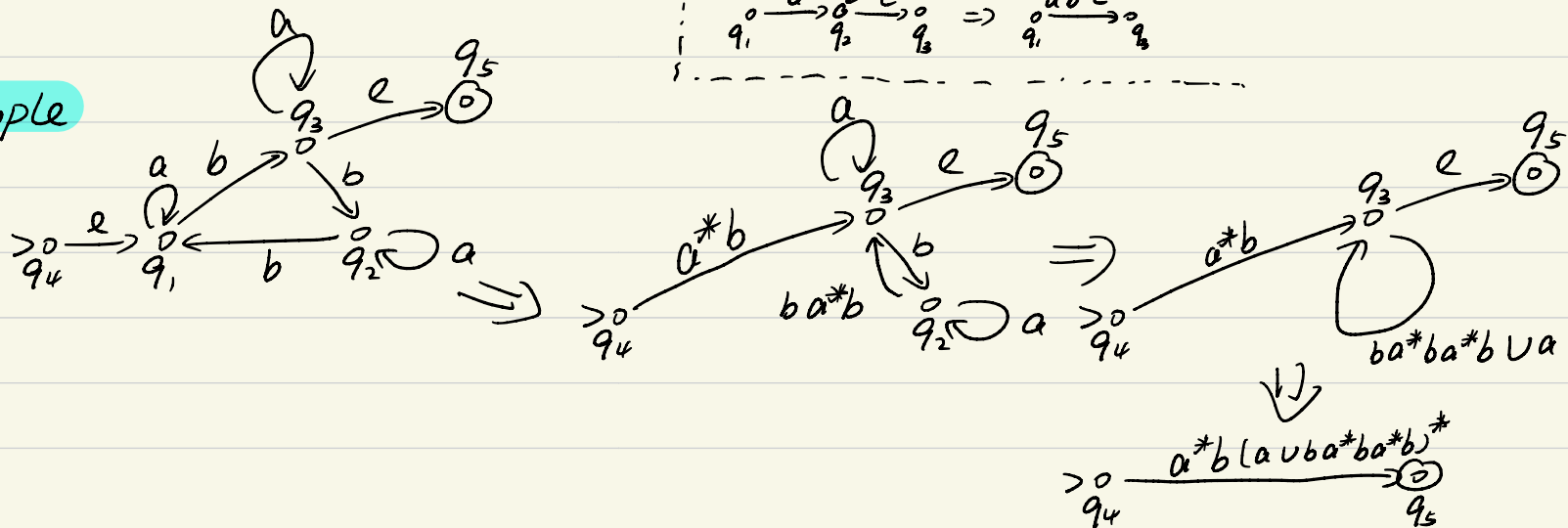
- a) no arc enters the initial state
- b) only one final state with no arc leaving it.



(2) eliminate states



Example



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

- (1)  $K = \{q_1, \dots, q_n\}$ ,  $s = q_{n-1}$ ,  $F = \{q_n\}$
- (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.  $L(R) = L(M)$

非递归  
(DP)

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

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

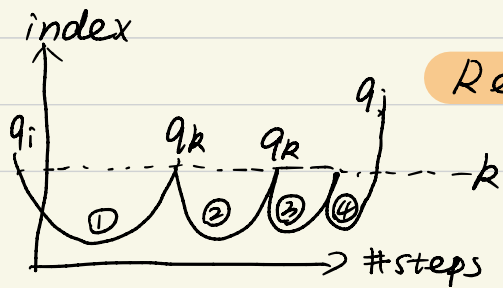
$R_{ij}^k$

e.g. 在上图中  $L_{11}^0 = \{a, \epsilon\}$   $\triangleleft$   $aa$  is wrong since  $q_1 \xrightarrow{a} q_2 \xrightarrow{a} q_1$   
 $R_{11}^0 = \phi^* \cup a$   
 $L_{13}^0 = \{b\}$   
 $L_{41}^1 = \{\epsilon, a, aa, \dots\}$

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

Base case:  $k=0$

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

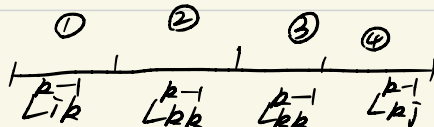


Recurrence

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

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

(删除状态  $\Rightarrow$   $\uparrow k$ )



## Pumping theorem

Let  $L$  be regular language, There exists an integer  $p \geq 1$  <sup>pumping length</sup> such that for  $w \in L$  with  $|w| \geq p$ , we can divide 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.

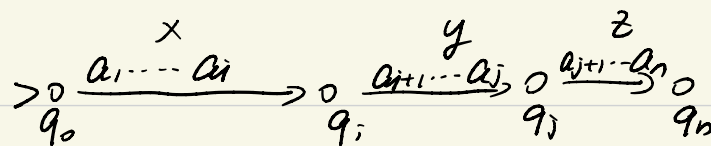
$L$  is regular  $\Rightarrow \exists$  DFA  $M$  accepting  $L$ .

Let  $p = \#$  states of  $M$ .

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

$w = a_1 \dots a_n$  设  $\begin{matrix} & a_1 & a_2 & \dots & a_n \\ \xrightarrow{q_0} & q_1 & q_2 & \dots & q_n \end{matrix}$

$\exists 0 \leq i < j \leq p$ ,  $q_i = q_j$ , 以  $q_i, q_j$  为界, 三分



$0^r$

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

(1)  $xy^kz \in L$  for any  $k \geq 0$      $q_0 \xrightarrow{x} q_i \xrightarrow{y} q_i \xrightarrow{z} q_n$

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

反证: Assume  $L$  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  $k \geq 0$ ,  $xy^kz \in L$
- 2)  $|y| \geq 1$
- 3)  $|xy| \leq p$

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

contradicting (1)

Example.  $\{w \in \{0,1\}^* : w \text{ contains equal numbers of 0's and 1's}\}$  is not regular.

可用 pumping thm. Assume  $L$  is regular

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

$\Downarrow$   
 $\{0^n 1^n : n \geq 0\}$

# Regular Languages



closure.  $\cup$ .  $\cap$ .  $\emptyset$ .  $*$ .  $-$

pumping theorem (regular 的必要条件)

## Context-free language

## Context-free grammar (CFG)

左边可以替换为右边

$S \rightarrow aSb$        $S$ : start symbol

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

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

$A \rightarrow \epsilon$

$S \stackrel{1}{\Rightarrow} aSb \stackrel{1}{\Rightarrow} aaSbb \stackrel{2}{\Rightarrow} aaAbb \stackrel{4}{\Rightarrow} aabb$  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

·  $S \in V - \Sigma$ : 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  $A \in V$ .

$xAy \Rightarrow_a xuy$  if  $(A, u) \in R$

derive in one step.

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

$w \Rightarrow_a^* u$  if  $w = u$  or  $w \Rightarrow_a \dots \Rightarrow_a u$

↑  
terminals

derive from  $w$  to  $u$  of length  $n$ .

$G$  generates a string  $w \in \Sigma^*$  if  $s \Rightarrow_a^* w$

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

$G$  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

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

Definition:

A CFG is in Chomsky normal form (CNF) if

every of its rule is one of the following form:

1.  $S \rightarrow \epsilon$
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  $2n-1$  次



# Theorem:

$\forall$  CFG  $\rightarrow$  CFG in CNF

proof sketch

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

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

e.g.  $B \rightarrow ACA \rightarrow \underbrace{CA} \mid \underbrace{AC} \mid \underbrace{C}$ . 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.  $A \rightarrow B \rightarrow CDE$  删去后补上  $A \rightarrow CDE$  向后补偿

向后补偿

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

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

$v_2 \rightarrow u_2 v_3$

$\vdots$

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

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.  $C \rightarrow ADA$  不能补

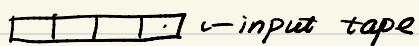
$C \rightarrow BDA$   
 $A \rightarrow DB$   
 $B \rightarrow DB$

$\therefore$  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  $P = (K, \Gamma, \Sigma, \Delta, s, F)$

state  
input symbol  
start, final  
stack alphabet

$\Delta$ : transition relation

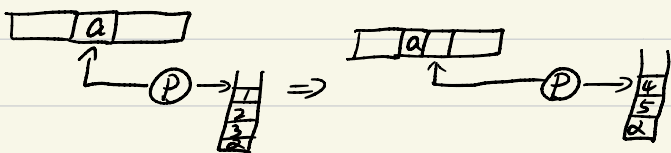
a finite subset of  $(K \times (\Sigma \cup \epsilon)) \times \Gamma^* \times (K \times \Gamma^*)$

a string at the top of stack  
pop  
push onto stack

匹配状态, 删除匹配串, push新串

## Example

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

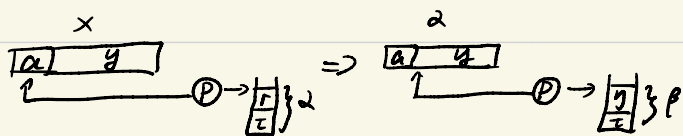


$(p, a, \epsilon), (q, \beta)$

无论栈内有什么, 均可匹配

A configuration of  $P$  is a member of  $K \times \Sigma^* \times \Gamma^*$   
stack element

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



$(p, x, \alpha) \vdash_p^* (q, y, \beta)$  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 空
- ③ stack 空

$(s, w, \epsilon) \vdash_p^* (q, \epsilon, \epsilon)$  for some  $q \in F$

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

**Example.**

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

$\begin{matrix} \text{0. push 1 / pop} \\ \curvearrowright \\ \text{0} \\ \curvearrowleft \\ \text{1. pop / push 1} \end{matrix} \{ (q, 0, 1), (q, \epsilon) \}$   
 $\{ (q, 0, \epsilon), (q, 1) \}$   
 $\{ (q, 1, 1), (q, \epsilon) \}$   
 $\{ (q, 1, \epsilon), (q, 1) \}$

NFA! guess!

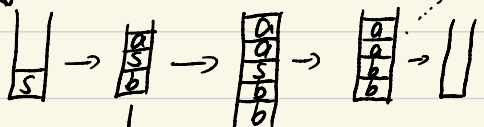
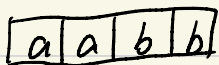
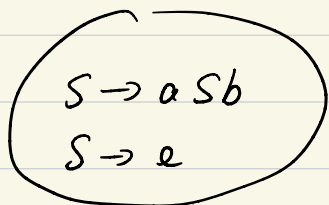
# 1. CFG $\Rightarrow$ PDA

2. CFL properties: closure properties, pumping theorem

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

Idea:

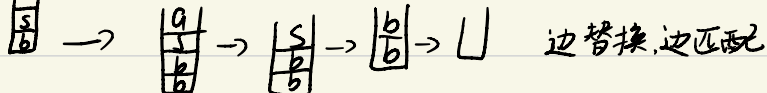
1. in stack, non-deterministically generate a string from  $S$
2. compare it to the input
3. accept if match



与input同, 消掉

? PDA 只能对栈顶有限长的串 push/pop (若  $S$  藏在下面, 难以操作)

让 non-terminal 溶于栈底



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

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

$K = \{s, f\}$      $F = \{f\}$

$T = V$

$\Delta = \{(s, \epsilon, \epsilon), (f, S)\}$

① 推  $S$  入栈

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

$\{(f, \epsilon, A), (f, u)\}$  for each  $(A, u) \in R$     ③ 栈顶 non-terminal  $\rightarrow$  非确定换掉

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  $\alpha = \epsilon$  and  $|\beta|=1$       要么只push一个, 要么只pop一个

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

PDA  $\rightarrow$  simple PDA

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

for each  $q \in F$ : add a new transition  $(q, \epsilon, \epsilon), (f', \epsilon)$

$F := \{f'\}$

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

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

2.3  $\alpha = \epsilon$  and  $|\beta| > 1$       pop  $> 1$

2.4  $\alpha = \beta = \epsilon$       nop

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

先做 pop 再做 push

↳ add new state  $r$

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

$(r, \epsilon, \epsilon), (q, \beta)$       push  $\beta$

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

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

$(p, a, c_1), (q, \epsilon)$  拆成  $k$  步

$(r_1, \epsilon, c_2), (r_2, \epsilon)$

$\vdots$

$(r_{k-1}, \epsilon, c_k), (q, \epsilon)$

2.3 同理

2.4  $(p, a, \epsilon), (q, \epsilon)$

add a new state  $r$

pick  $b \in T$

$(p, a, \epsilon), (r, b)$  先 push 再 pop 出来 (同一个元素)

$(r, \epsilon, b), (q, \epsilon)$

## Simple PDA $\rightarrow$ CFG

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

$\rightarrow$  subproblem

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

Goal:  $Apq \Rightarrow^* w \in \Sigma^*$  if and only if  $(p, w, \epsilon) \vdash_m^* (q, \epsilon, \epsilon)$  希望制定  $R$  使这成立

$\therefore S = A s f$  ( $\because$ )

我们希望  $L(G) = L(M)$

$S \Rightarrow^* w$  iff  $w \in L(M)$   
 $w \in L(G) \iff (s, w, \epsilon) \vdash_m^* (f, \epsilon)$

R:

(recurrence)

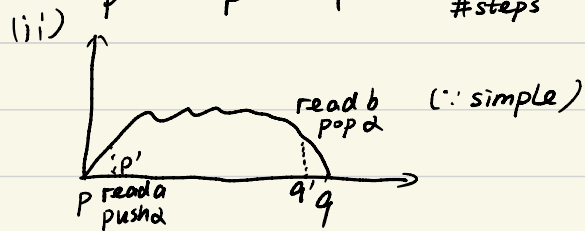
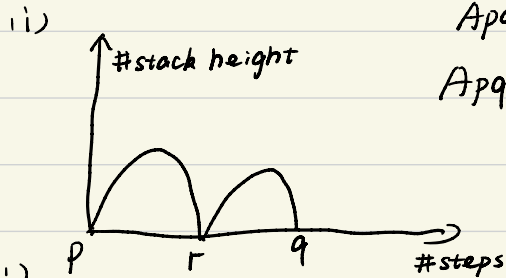
①  $\forall p \in K$

$App \rightarrow \epsilon$

②  $\forall p, q \in K$

→ 枚举

$Apq \rightarrow Apr Arq \quad \forall r \in K$   
 $Apq \rightarrow a Ap'q' b \quad \forall ((p, a, \alpha), (p', \alpha)) \in \Delta \text{ for some } \alpha \in T$   
 $((q', b, \alpha), (q, \epsilon))$



Prove that  $Apq \Rightarrow^* w \in \Sigma^*$  iff  $(p, w, \epsilon) \vdash_M^* (q, \epsilon, \epsilon)$

$\Rightarrow$  by induction on length of derivation from  $Apq$  to  $w$

$\Leftarrow$  by induction on #steps of computation

PDA <sup>defines</sup>  $\rightarrow$  CFL

Theorem.

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

CFL closure properties  $\cup, \cap, *, \checkmark$

$\cap, \bar{A}, \times$

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

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

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

$$C_{A \cup B} : S \rightarrow SA \mid SB$$

$$C_{A \cdot B} : S \rightarrow SA S_B$$

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

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

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

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

not context-free (by pumping theorem)

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

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 into 5 pieces  $w = uvxyz$  satisfying

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

$$(2) \quad |v| + |y| > 0 \quad \text{不能同时为空}$$

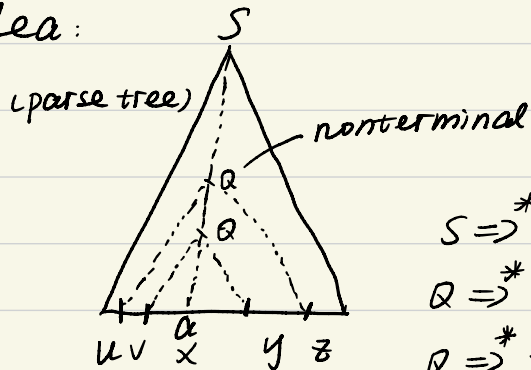
$$(3) \quad |vxy| \leq p$$



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

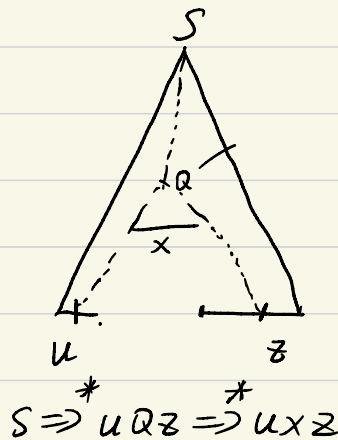
$$ab = \underset{u}{e} \cdot \underset{v}{a} \cdot \underset{x}{e} \cdot \underset{y}{b} \cdot \underset{z}{e}$$

Idea:

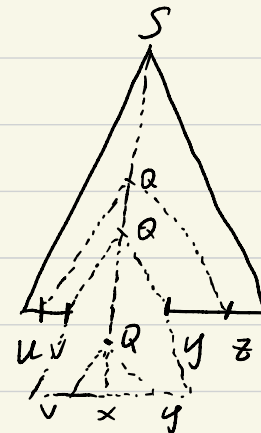


一条 path. 除了 leaf 均是 non-terminal  
path 是 ~~非空~~ 必有重复的 nonterminal 这里选最长的 SQQA

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



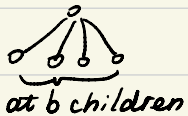
$$S \Rightarrow^* u Q z \Rightarrow^* u x z$$



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

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

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

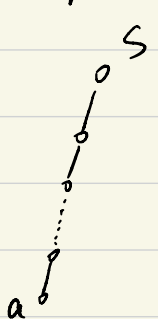


fanout  $\leq b$

Fact: if a tree with 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  $T \geq \log_b p = |V-\Sigma|+1$

#edges  $\geq |V-\Sigma|+1$

#nodes  $\geq |V-\Sigma|+2$

#non-terminals  $\geq |V-\Sigma|+1$

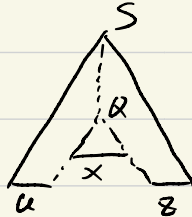
$\Downarrow$   
 some non-terminal  $Q$  appears at least twice  
 $\Downarrow$   
 choose the lowest pair

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

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

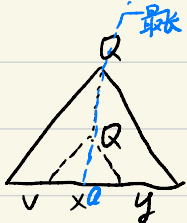
反证 if  $v=y=e$ .

$w = uxz$



is smaller than  $T$ . contradiction

(3)  $|vxy| \leq p$



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

height: length of  $QQA$ . ( $\because SQQA$  最长)

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

$\Downarrow$   
 选  $Q$  时, 选最低的一对 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.  $a^p b^p c^p = uvxyz$

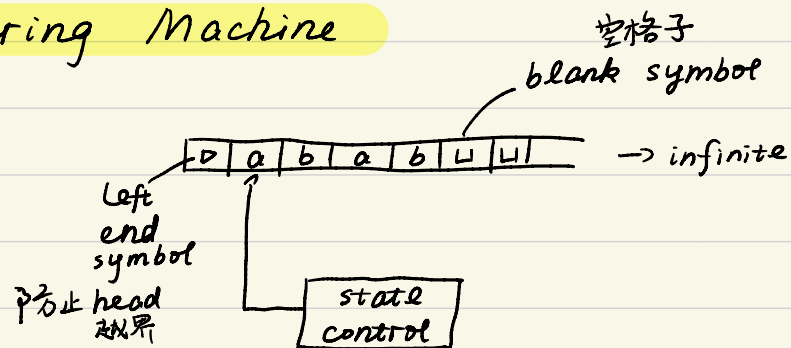
(3)  $|vxy| \leq p \Rightarrow$  at least one of  $a$  and  $c$

does not appear in  $v$  or  $y$ .

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

$uv^x y^0 z \in L$  contradiction

# Turing Machine



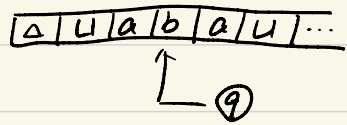
1.  $\leftarrow \rightarrow$
2. read & write

## Definition:

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

- $K$ : a finite set of states
- $\Sigma$ : tape alphabet (containing  $\emptyset$  and  $\sqcup$ )
- $s \in K$ : initial state
- $H \subseteq K$ : a set of halting states
- $\delta$ : transition function  
 $(K - H) \times \Sigma \rightarrow K \times \{ \leftarrow, \rightarrow \} \cup \{ \emptyset \}$   
不能是 halt      移动      写 symbol  
当前格里的元素      head action

satisfy for any  $q \in K$  在最左端  
 $\delta(q, \emptyset) = (p, \rightarrow)$  for some  $p$  只能  $\rightarrow$ , 不能  $\leftarrow$ , 也不能 overwrite



$$(q, \Delta u a b a) \Leftrightarrow (q, \Delta u a b, a)$$

特殊

$$(q, \Delta u a b a) \Leftrightarrow (q, \Delta u a b a, e)$$

A configuration a member of  $K \times \mathcal{D}(\Sigma - \{\Delta\})^* \times (\{e\} \cup (\Sigma - \{\Delta\})^* (\Sigma - \{\Delta, u\}))$  u 是 symbol 结尾

$$(q_1, \Delta w_1 a_1 u_1) \Gamma_M (q_2, \Delta w_2 a_2 u_2) \text{ if}$$

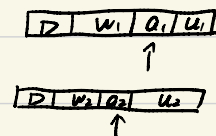
1) // writing

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

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  $a_1 = u_1 \cdot u_1 = e$  then  $u_2 = e$ )



③ // moving right

$$(q_1, \Delta w_1 a_1 u_1) \Gamma_M^* (q_2, \Delta w_2 a_2 u_2) \text{ if}$$

① " " = " " or

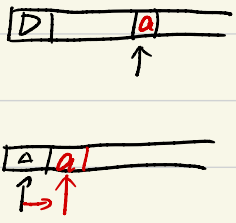
② " $\Gamma_M \dots \Gamma_M \dots \Gamma_M$ "  $n \geq 1$  steps

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

那么 initial config  $(s, ?)$

固定  
Fix  $\Sigma$ .

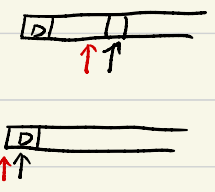
(1) symbol writing machine  $M_a$  ( $a \in \Sigma - \{D\}$ ) 作用:  $\left. \begin{array}{l} \text{初始指向 symbol 为 } D \rightarrow \text{then write } A \\ \dots \dots \dots \text{不为 } D \rightarrow \text{write } A. \end{array} \right\} \text{then halt}$



$$M_a = (\{s, h\}, \Sigma, \delta, s, sh)$$

for each  $b \in \Sigma - \{D\}$ ,  
 $\delta(s, b) = (h, a)$   
 $\delta(s, D) = (s, \rightarrow)$

(2) head moving machine  $M_{\leftarrow} M_{\rightarrow}$  左/右移读写头



若在 D, 则不动

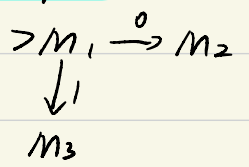
basic machines:  $M_a, M_L, M_R$   
 $a, L, R$

Left-shifting machine  $S_{\leftarrow}$

for any  $v \in (\Sigma - \{D, U\})^*$

$$DUUWU \rightarrow DUWU \quad \text{整体左移一格}$$

Example



1. run  $M_1$ , until it halts ——— 停机时看此时读写头
2. if the current symbol is  $0$ , run  $M_2$
3.  $\dots \dots \dots 1$ , run  $M_3$
4. else halt.

$$\begin{array}{c} >R \xrightarrow{\Sigma} R \\ \Downarrow \\ >RR \Leftrightarrow >R^2 \end{array}$$

$$>R \xrightarrow{a+U} R_a \quad (R_a: R \xrightarrow{\Sigma} a)$$

$Ru$ :  $\rightarrow R \curvearrowright \bar{u}$  : 找到当前读写头右第一个空格

$R\bar{u}$   $\rightarrow R \curvearrowright u$  : ..... 非空格 (可能不会 halt, 即全是空格)

$Lu$   $\curvearrowleft \bar{u}$        $L\bar{u}$   $\curvearrowleft u$

$\therefore S_c$  可以这样表示

$\rightarrow Lu \rightarrow R \xrightarrow{q \neq u} ULaR$

pos 当前写空格  
先移到左边第一个空格

$u \downarrow$   
 $L$

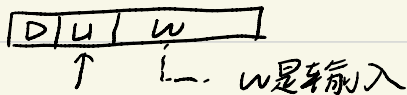
### Recognize Language

$$M = (K, \Sigma, \delta, s, H)$$

通过是否停机  
辨别语言

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

initial config:  $(s, D U w)$



$$L(M) = \{w \in \Sigma_0^* : (s, D U w) \vdash_m^* (h, D w) \text{ for some } h \in H\}$$

$M$  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  $M = (K, \Sigma_0, \Sigma, \delta, s, f, y, n\{ \})$  be a TM.

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

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

$(s, D \sqcup w) \vdash_M^* (y, \dots)$  we say  $M$  accepts  $w$ .

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

$(s, D \sqcup w) \vdash_M^* (n, \dots)$  ..... 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**

图灵机还可用来计算函数

for  $w \in \Sigma_0^*$ , if  $(s, D \sqcup w) \vdash_M^* (h, D \sqcup y)$  for  $h \in H$ ,  $y \in \Sigma_0^*$

input

$[D \sqcup y]$

output

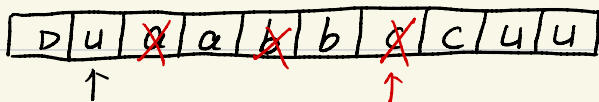
$y = M(w)$

称为 recursive / computable

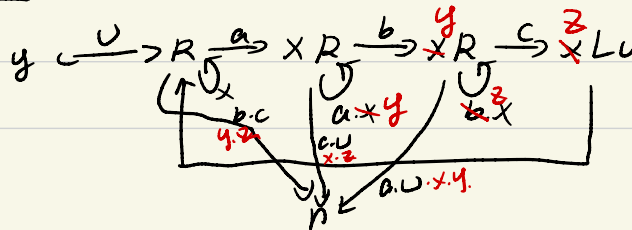
for any  $f: \Sigma_0^* \rightarrow \Sigma_0^*$ , we say  $M$  **computes**  $f$  if for any  $w \in \Sigma_0^*$ ,

$M(w) = f(w)$

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



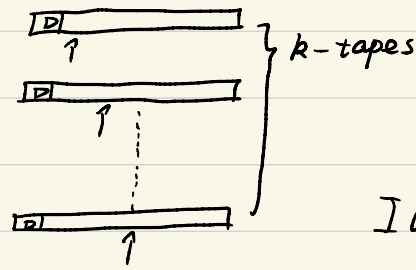
每次删一个 a.b.c



abc. abc?  
把又变为 x.y.z



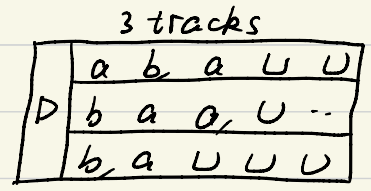
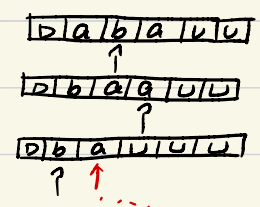
# 1. multiple tapes



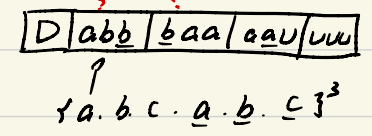
$$S: (k-H) \times \Sigma^k \rightarrow K \times (\{\Sigma - \Delta\} \cup \{\leftarrow, \rightarrow\})^k$$

Idea: 3-tapes

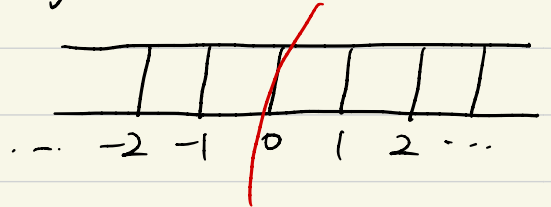
single tape



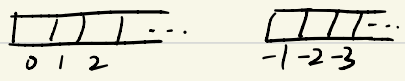
实际: k



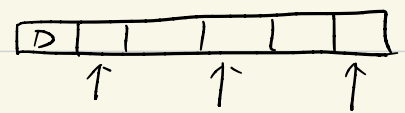
# 2. Two-way infinite tape



用 2-tape 模拟



# 3. multiple head

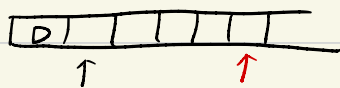


每次扫一遍确定头的位置. 再操作

#### 4. Two-dimensional tape

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

#### 5. Random access



head 可以跳  $\Rightarrow$  拆成若干步

★

#### 6. non-deterministic TM (NTM)

非确定性图灵机

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

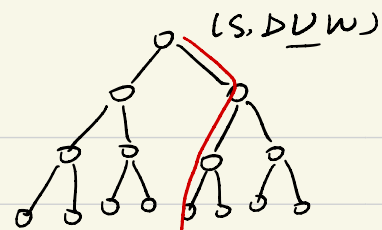
$\Delta$ : relation (not function)

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

configuration  $(q, Dababb)$

$\Gamma_M$   $\Gamma_M^*$   $\Gamma_M^N$ : yields' in  $N$  steps

A NTM  $M = (K, \Sigma, \Delta, s, H)$  with input alphabet  $\Sigma_0$  semidecides  $L \subseteq \Sigma_0^*$  if for any  $w \in \Sigma_0^*$ .  $w \in L$  if and only if  $(s, D \cup w) \Gamma_M^*(h, \dots)$  for some  $h \in H$ .  
 存在一条路



if  $w \in L$ , some branches halt  
 $\emptyset$  no ... ..

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

$M$  decides a language  $L \subseteq \Sigma^*$  if

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

每一个分支均在  $N$  步内停止

$$\exists N \quad (S, DUW) \vdash_M^N C$$

即  $\forall$  输入, 对应树 height  $< N$

$$(2) w \in L \iff (S, DUW) \vdash_M^* (y, \dots)$$

(若  $w \notin L$ , 则所有分支都会停在  $n$  上)

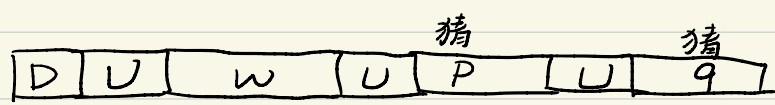
some branch halts with  $y$ .

**Example.**

Let  $C = \{ \text{binary encodings of composite numbers} \}$

合数

猜是否是两个数的乘积

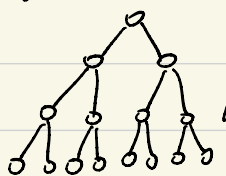


(1) 有限步停机

(2)  $\checkmark$

**Theorem: Every NTM can be simulated by DTM.**

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



DFM searching for a halting state BFS (no DFS)

3-tape DTM to simulate  $N$ .

D	U	W	
---	---	---	--

 store the input

D			
---	--	--	--

 simulate  $N$  在树上向下走

0 1 00 01 10 11 000...  

D			
---	--	--	--

 enumerate hint 记录纸带往哪走 实际中为有限个分叉 (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)

problem equals languages

编码

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

A finite collection of finite sets can be encoded.

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

$\Downarrow$   
FA, PDA, TM, CFG, REG

Object  $D \rightarrow$  "0" 表示它的编码

decide problem (recursive languages)

Problem

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

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

by defaults { 0.1 if input is illegal, reject  
0.2 decode "D" "w" to obtain D and w

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

$M_{R2} =$  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  $AREX = \{ \langle R, w \rangle : R \text{ is a regular expression that generates } w \}$

$M_{R3} =$  on input  $\langle R, w \rangle$

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

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

R4.  $EDFA = \{ \langle D \rangle : D \text{ is a DFA with } L(D) = \emptyset \}$

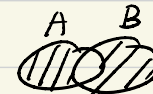
$M_{R4} =$  on input  $\langle D \rangle$

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.  $EQ_{DFA} = \{ \langle D_1, D_2 \rangle : D_1 \text{ and } D_2 \text{ are two DFAs with } L(D_1) = L(D_2) \}$

Hint: ① 利用 R4

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



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



Proof:  $\exists M_B$  decides  $B$ .

$M_A =$  on input  $x$ .  $f$   
可计算

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

### Example

$C1 = \{ \langle G \rangle \langle w \rangle : G \text{ is a CFG that generates } w \}$

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

1.  $G \rightarrow G'$  in CNF
2. enumerate all derivations of length  $2|w|-1$
3. if any of them generates  $w$ .
4. accept " $G \langle w \rangle$ "
5. else
6. reject " $G \langle w \rangle$ "

$C2 = \{ \langle P \rangle \langle w \rangle : P \text{ is a PDA that accepts } w \}$

$C2 \text{ APDA} \rightarrow \text{ACFG}$   
 $\langle P \rangle \langle w \rangle \rightarrow \langle G \rangle \langle w \rangle$



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

$S \rightarrow Aa$

从 terminal 和  $\epsilon$  开始. 若  $\rightarrow$  右 symbol 被标记,  $\rightarrow$  左边 symbol 也被标记.

$A \rightarrow Bb$

若 start symbol 是否被标记

$B \rightarrow AC$

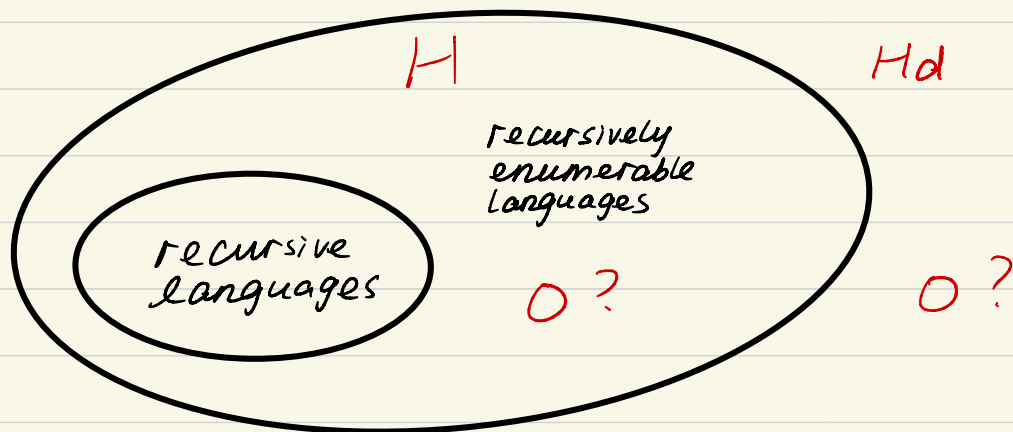
$C \rightarrow \epsilon$

$C \rightarrow a$

$B \rightarrow b$

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

$C_4 \leq C_3$



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

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

proof:  $\Rightarrow \checkmark$

otherwise finite  $\rightarrow$  trivial

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

$\Downarrow$   
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

$A'$  countable

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

**Lemma:** Let  $\Sigma$  be an alphabet.  $\Sigma^*$  is countable.

proof: <sup>e.g.</sup>  $\Sigma = \{0, 1\}$

e, 0, 1, 00, 01, 10, 11, ...  
 $\downarrow \quad \downarrow \quad \downarrow \quad \downarrow$   
 0, 1, 2, 3, ...

要讲  $\forall s \in \Sigma^*, \exists f(s) \quad \# \text{ strings with } \leq |s| : 2^{|s|}$

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

图灵机可以进行编码

且每台TM仅能半判定一个问题

**Lemma:** Let  $\Sigma$  be some alphabet

Let  $\mathcal{L}$  be the set of all the languages over  $\Sigma$ .

$\mathcal{L}$  is uncountable.

$\Rightarrow \exists$  language is not recursively enumerable.

(TM 可数, 问题不可数)

Proof: suppose  $\mathcal{L}$  is countable

$\Downarrow$

$L_1, L_2, L_3, \dots$

since  $\Sigma^*$  is countable. 所有串

$s_1, s_2, s_3, \dots$

构造:  $D = \{s_i : s_i \notin L_i\} \in \mathcal{L}$  contradiction

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

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

	$s_1$	$s_2$	$s_3$	...
$L_1$	1	0	0	
$L_2$	0	1	0	...
$L_3$	1	0	0	...
$L_4$				...
$\vdots$				

D: 与  $L_i$  每一行都不同

取反

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

**Theorem:**  $H$  is recursively enumerable.

universal  $\leftarrow$  U = on input " $M$ " " $w$ "  
TM

1. run  $M$  on  $w$

U halt on " $M$ " " $w$ "  $\Leftrightarrow M$  halts on  $w$   
( " $M$ " " $w$ "  $\in H$  )

$L(U) = H$

**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  $H$

Let  $M_d =$  on input " $M$ "

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

2. If  $M_H$  accepts " $M$ " " $w$ "  
reject " $M$ "

3. else

accept " $M$ "

反证

② Assume  $\dots \Rightarrow \exists D$  semidecides  $H_d$

$D$  on input  $m$   $\left\{ \begin{array}{l} \text{halt, if } \langle m \rangle \in H_d \text{ ( } M \text{ does not halt on } \langle m \rangle \text{ )} \\ \text{not halt, if } \langle m \rangle \notin H_d \text{ ( } M \text{ halts on } \langle m \rangle \text{ )} \end{array} \right.$

Let  $M = D$ ?

$D$  halts on " $D$ "  $\Leftrightarrow D$  does not halt on " $D$ "

$\emptyset$

	$M_1$	$M_2$	$M_3$
$M_1$	1	0	0
$M_2$	0	1	0
$M_3$	1	0	0
D	0	0	1

halt

刻画 problem 复杂度关系

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

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

$$H \leq A_1$$

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

保证映射前后答案一样

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

我们要构造  $M^*$  使其满足

$$\text{令 } M^* = \text{on input } u$$

1. run  $M$  on  $w$

$$M^* \text{ halts on } e \Leftrightarrow M^* \text{ halts on some input } \Leftrightarrow M \text{ halts on } w$$

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

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

$$H \leq A_2$$

同 ①

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

$$H \leq A_3$$

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

Hint: 从  $A_3$  归约: " $M$ "  $\rightarrow$  " $M_1, M_2$ "

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

$M_2 =$  on input  $x$

1. halt

Let  $M_1 = M$ , then  $M$  halts on every input  $(\Leftrightarrow) L(M) = \bigcup_{L(M_1)} L(M_2)$

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

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

$H$   $\overline{RTM}$   
 " $M, w$ "  $\rightarrow$   $M^*$

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

$M^* =$  on input  $x$

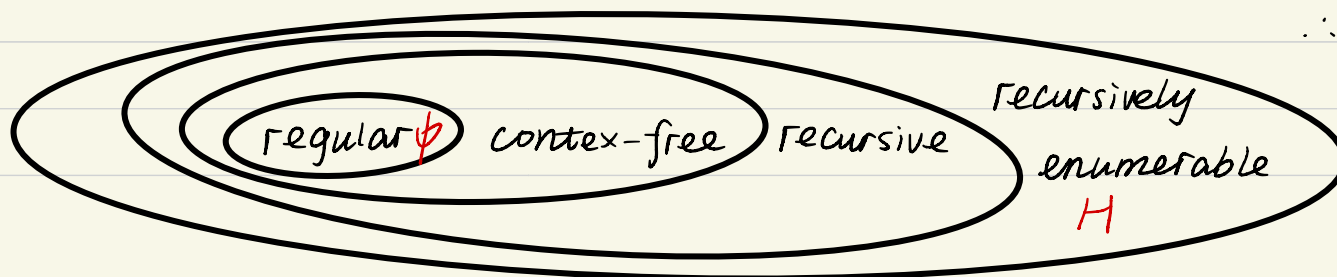
1. run  $M$  on  $w$

2. run  $U$  on  $x$

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

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

$\Downarrow$   
 $M$  halts on  $w$



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

$$H \in \overline{CF_T}$$

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

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

$$H \in \overline{REC_{TM}}$$

$A = \{ \langle M \rangle : M \text{ is a TM that halts on every input} \}$   $\rightarrow$  半判定

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

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

reduction from  $A$  to  $B$ .

$M_A =$  on input  $\langle M \rangle$   $\rightarrow$  on input  $x$   
1. halt

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

2. run  $M_B$  on  $\langle M \rangle \langle M^* \rangle$

3. return the result of  $M_B$ .

半判定

$\{ \langle M \rangle \mid M \text{ is a TM with } L(M) \text{ having property } P \}$

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

$\mathcal{L}(P) =$  the set of recursively enumerable languages satisfying  $P$

$RL(P) = \{ \langle M \rangle \mid M \text{ is a TM with } L(M) \in \mathcal{L}(P) \}$  不可判定?

if  $\mathcal{L}(P) = \emptyset$  or the set of all recursively enumerable,  $RL(P)$  is recursive.

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

then  $RL(P)$  is not recursive.

Proof:

Case 1.  $\emptyset \notin \text{dLP}$ . 则  $\exists A \in \text{dLP}$  且  $A \neq \emptyset$ .

$\Downarrow$   
 $\exists MA$  semidecides  $A$

要证:  $H \in \text{RLP}$   
 $\uparrow$   $\uparrow$   
 $M_H$   $M_R$

$M_H =$  on input "M" "w"

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

(1) run  $M$  on  $w$

(2) run  $MA$  on  $x$

2. run  $M_R$  on " $M^*$ "

3. return the result of  $M^*$

$\text{dLP}$   
则  $L(M^*) = \begin{cases} L(MA) = A, & \text{if } M \text{ halts on } w. \\ \emptyset, & \text{if } \dots \text{ not } \dots \end{cases}$   
 $\notin \text{dLP}$

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

Case 2:  $\emptyset \in \text{dLP}$ . 则  $\emptyset \in \overline{\text{dLP}}$

Summary

proving recursive  $\leftarrow$  by def (construct TM)

$A \in$  a known recursive language

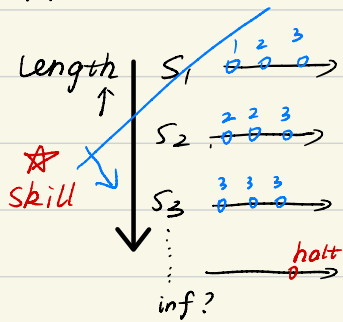
$H$  is not recursive. (Diagonalization)

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

proving recursively enumerable  $\leftarrow$   $A \in$  a known recursively enumerable language  
by def

Example

$A = \{ \langle M \rangle : M \text{ is a TM that halts on some input} \}$  is <sup>recursively</sup> enumerable.



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

只要有 halt. 一定能在有限步内找到

$MA =$  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:

halt

proving not recursively enumerable — A known non-recursively enumerable lang.  $\leq A$  theorem.

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

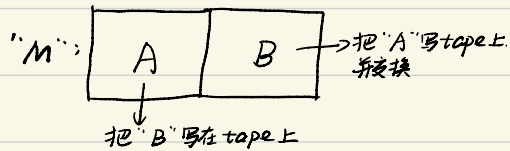
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## Closure property

	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"

要让 B 的定义不依赖于 A

循环定义?

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

$q$  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 := on input w. <sup>A 的输出</sup>

1. compute  $q(w)$   $q("B") = "A"$

2. write  $q(w) \cdot w$  on its tape  
"A" "B"

先运行 A 

"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 拿到了自己 encoding

作用: M = on input x

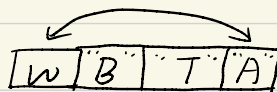
1. obtain "M" ← legal (可以在 TM 里有这样操作)

proof sketch.

"R": 

A	B	T
---	---	---

A: print "B" "T"



B: print "A" and reorder "A" "B" "T" = "R"

## Example

可用来证 H <sub>non-recursive</sub> Assume H is recursive,  $\exists M_H$  decides H.

R = on input w

拿到自己 code 后 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  
looping

4.  
5. else  $M_H$  rejects "R" w  
halt

→ Contradiction

Enumerator:

从空输入开始. 到  $q$  时记下  $w$

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

$$L = \{w : (s, D \sqcup) \vdash_m^* (q, D \sqcup w)\}$$

output  $w$

output state

Turing enumerable

Theorem. A language is 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

$s_1$	0	0	0
	1	2	3
$s_2$	0	0	0
	2	2	3
$s_3$	0	0	0
	3	3	3
...			

output  $s_i$  if  $M$  halts

同样串可能重复. 乱序输出  $\checkmark$

按字典序枚举

Let  $M$  be a TM that decides  $L$ , we say  $M$  Lexicographically enumerates  $L$  if whenever  $(q, D \sqcup w_1) \vdash_m^* (q, D \sqcup w_2)$ , 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 <sup>lexicographically</sup> enumerate  $L$
2. every time  $M$  outputs a string  $w$  → only order  $\leq x$   
(字典序  $> x \Rightarrow$  reject)
3. if  $w == x$ :
4. accept.

$\Leftarrow \exists M$  decides  $L$ .

$S_1$  \_\_\_\_\_  
 $S_2$  \_\_\_\_\_  
 $S_3$  \_\_\_\_\_  
⋮

一行行枚举即可 (decide, 必会停机)

**numerical function**

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

→ 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

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

(2) identity

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

(3) successor function

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

} computable

两种操作:

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

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

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

多元:  $g: N^k \rightarrow N, h: N^{k+2} \rightarrow N \Rightarrow f: N^{k+1} \rightarrow N$   
 $\begin{cases} f(n_1, \dots, n_k, 0) = g(n_1, \dots, n_k) \\ f(n_1, \dots, n_k, m+1) = h(n_1, \dots, n_k, m, f(n_1, \dots, n_k, m)) \end{cases}$  前一次的值

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

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

## Example.

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

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

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

$$\begin{cases} \text{plus}(m, 0) = m \end{cases}$$

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

严格  
应为关于  $m, n$  的  $\text{plus}(m, n)$  函数

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

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

$$\begin{cases} \text{mult}(m, 0) = 0 \quad \text{PR} \Rightarrow \text{PR} \end{cases}$$

$$\begin{cases} \text{mult}(m, n+1) = \text{plus}(\text{mult}(m, n), m) \end{cases}$$

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

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

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

做  $c$  次

(6) sgn function

$$\begin{cases} \text{sgn}(0) = 0 \end{cases}$$

$$\begin{cases} \text{sgn}(n+1) = 1 \quad // \quad h(n, \text{sgn}(n)) = 1 \end{cases}$$

(7) predecessor function

$$\text{pred}(n) = \begin{cases} n-1 & \text{if } n > 0 \\ 0 & \text{if } n = 0 \end{cases}$$

$$\Rightarrow \begin{cases} \text{pred}(0) = 0 \\ \text{pred}(n+1) = n = \text{id}_{2,1}(n, \text{pred}(n)) \end{cases}$$

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

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

+ - x  $\Rightarrow$  primitive recursive

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

$$(9) \text{positive}(n) = \begin{cases} 1 & \text{if } n > 0 \\ 0 & \text{if } n = 0 \end{cases} \quad \downarrow \text{sgn}(n) \quad \left. \vphantom{\begin{cases} 1 \\ 0 \end{cases}} \right\} \text{predicates}$$

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

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

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

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

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

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

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

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

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

(14)  $\text{div}(m, n) = \lfloor m/n \rfloor$  //  $n \neq 0$  <sup>假定</sup>

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

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

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

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

(16)  $p$ : primitive recursive predicates

bounded disjunction.  $g_p(n) = \begin{cases} 1 & \text{if } \exists 1 \leq i \leq n, p(i) = 1 \\ 0 & \text{if } \sim n \text{ 中是否有 } i \text{ 使 } p \text{ 为真} \end{cases}$

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

$g_p$  也是 p.r.

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

(17)  $\text{sum}_f(m, n) = \sum_{k=0}^n f(m, k)$  可证: if  $f$  is p.r., so is  $\text{sum}_f$ .

$\text{sum}_f(m, n) = f(m, 0) + \dots + f(m, n)$  // sum of  $n+1$  p.r. func.?

$n$  不是一个常数!



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

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



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

proof: basic functions are computable,  $\left. \begin{array}{l} \text{composition} \\ \text{recursive def} \end{array} \right\}$  preserve computability.

反之, All computable func. are primitive recursive? **X**

all p.r. func  $\Rightarrow$  expression 组合, 递归, 类似正则表达式

$\Downarrow$   
enumerate all the expression

$\Downarrow$   
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  $g^*$ , 但  $g^* \neq g_n \forall n$

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

basic functions +

$\left\{ \begin{array}{l} \text{composition} \\ \text{recursive def} \end{array} \right.$

$\left. \begin{array}{l} \text{composition} \\ \text{recursive def} \end{array} \right\}$

minimalization of minimalizable functions

$\mu$ -recursive  $\Leftrightarrow$  Computable

min 操作

$g(n_1, \dots, n_k, n_{k+1})$

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

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

**Example :**

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

$$\text{" } \mu p [ g e q((m+2)^p, n+1) = 1 ]$$

A function  $g$  is **minimalizable** if

(1)  $g$  is computable

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

└ 一个个试, 总会停机.

Minimalization of  $g$  is computable if  $g$  is minimalizable.

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

$$\mu\text{-recursive} = \text{basic functions} + \begin{cases} \text{composition} \\ \text{recursively def.} \\ \text{minimalization of minimalizable functions} \end{cases}$$

**Theorem:** A numerical function  $f$  is  $\mu$ -recursive  $\Leftrightarrow$  it is computable.

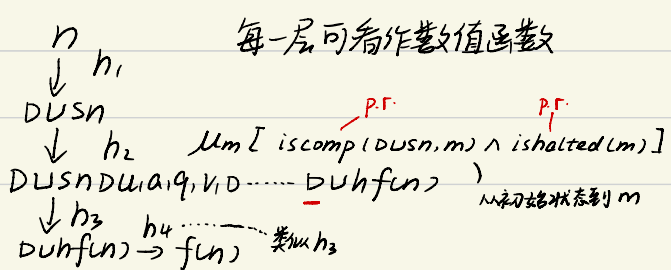
Proof:  $\Rightarrow$  trivial

$$\Leftarrow f. \exists M \text{ computes } f. \quad (s, D, \underbrace{U}_n) \Gamma_m (q, \underbrace{D, U, a, v, i, \dots}_{\dots}, \underbrace{r_m(h, D, U, f, n)}_{\dots})$$

可写作:

$$\underline{DUSNDU, a, q, v, i, D, \dots, DUhfn})} \quad \text{串可以看作一个数 (base-} b \text{ integer)}$$

$$\Sigma U_k \rightarrow \{0, \dots, b-1\} \quad (b = 1 + \Sigma U_k)$$



$$h_1(n) = DUS \cdot b^{\log_b n} + n$$

找到  $D$  并取出

$$h_3 : \mu_k [ \text{digit}(k, n, b) == D ] \text{ 得 } k^*$$

$$\text{rem}(n, b^{k^*+1}) \quad \text{ } n \text{ 用 } b \text{ 进制下的第 } k^* \text{ 位}$$

# Grammar (Conrestricted grammar)

CFA:  $A \rightarrow u, B \rightarrow v, \dots$  可以与上下文有关 <sup>e.g.</sup>  $uAv \rightarrow w$

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  $(\underbrace{V^*}_{\text{context}} \underbrace{(V - \Sigma)}_{\text{nonterminal}} V^*) \times V^*$

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

## Example.

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

$$S \rightarrow ABCS \quad ABCABC \dots$$

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

$$S \rightarrow Tc \quad CTc \rightarrow TcC \quad BTc \rightarrow BTb \quad \text{从右往左扫}$$

$$BTb \rightarrow Tbb \quad ATb \rightarrow ATa$$

$$ATa \rightarrow Taa \quad Ta \rightarrow \epsilon$$

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

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

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



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

对于  $w \in L(M)$ :  $(s, DUW) \Gamma_M(q_1, DU, a, v_1) \dots \Gamma_M(h, DU)$

$DU \swarrow \Gamma_M \searrow DU, a, q, v_1 \dots \Gamma_M \searrow DU, h$

用 state 标记下划线位置

$$S \Rightarrow \underline{DUh\Delta} \Rightarrow \dots \Rightarrow \underline{DU, a, q, V, \Delta} \Rightarrow \underline{DUSW\Delta} \Rightarrow W$$

$$\textcircled{1} S \rightarrow DUh\Delta \quad ? \quad \textcircled{2} DUS \rightarrow e$$

$$\Delta \rightarrow e$$

②

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

$$uaqv\Delta \quad \Gamma_M \quad ubpv\Delta \quad bp \rightarrow aq$$

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

$$uaqbv\Delta \quad \Gamma_M \quad uabpv\Delta \quad \underline{abp} \rightarrow \underline{aqb} \text{ for } b \in \Sigma$$

若  $b, v$  为空格 if  $b = \sqcup, v = \sqcup \Rightarrow uaqv\Delta \Rightarrow uaup\Delta \quad aup \rightarrow aq$

左移 ...

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

复杂度

decidable vs. undecidable

resource: time, space

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

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

$$\boxed{00001111} \quad \log_2 n \cdot O(n) = O(n \log n) \quad \text{每次扫消掉一半 0 和 1 (隔一格消)}$$

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

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

$$A = \{0^k 1^k : k \geq 0\} \quad \text{2-tape: } O(N) \quad \text{依赖于特定TM (单带)}$$





# subproblems:  $\frac{n^2}{2}$  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.

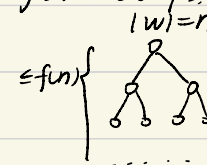
SAT  $\in P$ ? unknown

↓ 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  $\checkmark$

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  $f: \mathbb{N} \rightarrow \mathbb{N}$  such that for any input of length  $n$ , every branch of  $M$  halts with  $f(n)$  steps.

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 variable 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 " $x$ " $y$ "
- (2) if  $x \notin A$ ,  $\forall y$  ... rejects ...

Example  $A = \text{SAT}$ ,  $x =$  boolean formula,  $y =$  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  $|y| \in \text{poly}(|x|)$
2. run  $V$  on " $x$ " $y$ "
3. if  $V$  accepts " $x$ " $y$ "  
accept
4. else  
reject

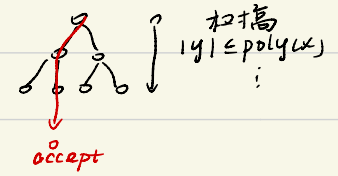
$\Leftarrow \exists$  NTM  $M$  decides  $A$  in poly time.

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:  $P \neq NP$

$[P \subseteq NP]$   $\left\{ \begin{array}{l} \text{a NTM is a DTM} \\ A \in P: \text{DTM } D, \text{ 这样不需要 certificate} \end{array} \right.$

$V =$  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  $B$  (记作  $A \leq B$ )

$\uparrow$   
 $f$  can be computed by some DTM in  $\text{poly}(n)$  time.

$\downarrow$   
 $A \leq_p B$  "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  $|f(x)| \leq \text{poly}(|x|)$   
 $\downarrow$  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  $f(x) = x$

SAT  $\leq_p$  3SAT

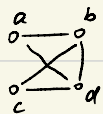
$(x_1 \vee x_2) \Rightarrow (x_1 \vee x_2 \vee y) \wedge (x_1 \vee x_2 \vee \bar{y})$

$(x_1 \vee x_2 \vee x_3 \vee x_4 \vee x_5) \Rightarrow (x_1 \vee x_2 \vee y) \wedge (x_3 \vee x_4 \vee x_5 \vee \bar{y}) \Rightarrow \dots$   
至少一项为真

$3 \cdot (k-2) = O(k)$   
 $\downarrow$  括号内长度

**Clique** 团问题

$G = (V, E)$



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.  $\{a, b\} \checkmark \{a, b, d\} \checkmark \{a, b, c, d\} \times$

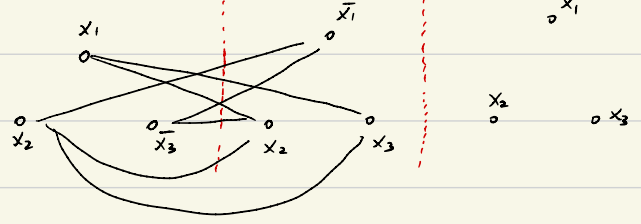
CLIQUE =  $\{ \langle G, k \rangle : G \text{ has a clique of at least } k \}$

要证: 3-SAT  $\leq_p$  CLIQUE

$F \Rightarrow G, k$



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



$m$  clauses

then  $k = m$

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

$\Rightarrow$   $\checkmark$

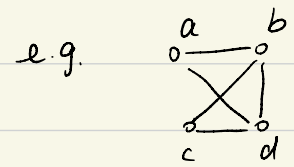
$\Leftarrow$  团至多包含一个组中的一个点  $\Rightarrow k$  个点的团中  $k$  个组均有选点

$C_i$ : # nodes:  $3m$ , # 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  $V'$ .



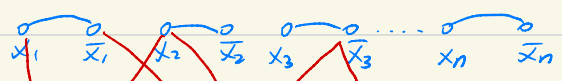
$\{a, b, d\} \checkmark$      $\{a, d\} \times$

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

要证:  $3\text{-SAT} \leq_p VC$

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

$2n$  nodes



$n$  条蓝边

$3m$  nodes



$3m$  条红边

$3m$  条黑边

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

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

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

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

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.

$$A \leq_p SAT$$

$$x \longrightarrow F$$

$$x \in A \Leftrightarrow F \text{ is satisfiable}$$

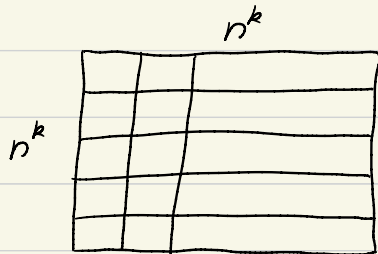
$\exists$  NTM  $N$  decides  $A$  in  $n^k$  time  $a_1, \dots, a_n \in A$ .

$$\Leftrightarrow \exists (s, DU, a_1, \dots, a_n) r_m (q_1, DU, a_1, v_1) r_m \dots r_m (y, DU, a_n)$$

$$\Leftrightarrow \exists \underbrace{DU, a_1, \dots, a_n, r_m, DU, a_1, q_1, v_1, r_m, \dots, r_m, DU, a_n, y, v_n}_{\in n^k \text{ configurations of length } n^k}$$

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

?



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

$$x_{ijc} \text{ for each } i \text{ and } j \quad \sum_{c \in K \cup \Sigma} x_{ijc} \geq 1 \Leftrightarrow \forall_{c \in K \cup \Sigma} x_{ijc}$$

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

让初始行统一  $x_{110} = 1 \wedge x_{120} = 1 \wedge x_{130} = 1 \wedge \dots$

要保证行按顺序(第2行接着第1行操作)

$c_1$	$c_2$	$c_3$
$c_1$	$c_2$	$c_3$

$c_1$	$c_2$	$c_3$
$q$	$c_2$	$c_3$

$c_1$	$q$	$c_3$
$c_1$	$p$	$c_3$

.....

$$\# \text{legal } 2 \times 3 \text{ rectangle} \in \text{KUSI}^6$$

Theorem: If  $A$  is NP-complete, and

(1)  $B \in \text{NP}$

(2)  $A \leq_p B$

then  $B$  is NP-complete.

Proof:  $\forall L' \in \text{NP}, L \leq_p A$  又  $\because A \leq_p B \Rightarrow L \leq_p B$  归纳传递性

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.

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

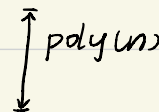
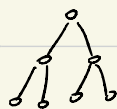
$\text{NPSPACE} = \{A \mid \dots \dots \dots \text{NTM} \dots \dots \dots\}$

$P \subseteq \text{PSPACE}$

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

then it runs in  $f(n)$  space. "走这么多格"

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



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  $f(n)$  space and it halts on all inputs,  
 then it runs in  $|K| \cdot f(n) \cdot |\Sigma|^{f(n)}$  time.

configuration 不会重复 (否则有 loop)  
 ↓  
 最多步数取决于 configuration 个数  
 ↓  
 状态  $|K|$   
 位置  $f(n)$   
 纸带上写的  $|\Sigma|^{f(n)}$

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

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

$\neq?$     $\neq?$     $\neq?$    unknown  $\Rightarrow$  但可以证明 P  $\neq$  EXP. 则必有一个真包含.

**Theorem:** NPSPACE = PSPACE

**Savitch's theorem:** If A is decided by some NTM in  $f(n)$  space where  $f(n) \geq n$ ,  
 then it is decided by some DTM in  $O(f(n)^2)$  space.

错误证明: 要记每一步的选择  $f(n) + c^{f(n)}$  total space

proof:  $C_{init} \rightsquigarrow C_{accept}$  // all configurations use  $f(n)$  space

$\Downarrow$  within  $2^{f(n)}$  steps

$\exists C', C_{init} \rightsquigarrow C'$  within  $2^{f(n)-1}$  steps

$C' \rightsquigarrow C_{accept}$  within  $2^{f(n)-1}$  steps.  
 未知, 但  $2^{f(n)}$  choices  
 ↓  
 枚举 (对空间)

$Y =$  on input  $C_1, C_2, t$

只内存  $C_1, C_2$

$S(1) = O(f(n))$

1. if  $t = 1$
2. if  $C_1 = C_2$  or  $C_1 \Gamma_m C_2$ .
3. accept
4. else
5. reject

Line 7.8 可以复用

- $S(t) = O(f(n)) + S(\frac{t}{2})$   
 $\Rightarrow S(t) = O(f(n) \cdot \log t)$
6. for all configurations  $c'$  using  $\leq f(n)$  space
  7. run  $\gamma$  on  $G, c', \frac{t}{2}$
  8. run  $\gamma$  on  $c', c_2, \frac{t}{2}$
  9. If both accept,
  10. accept,
  11. reject
- run  $\gamma$  on  $C_{init}, C_{accept}, 2^{f(n)}$
- $O(f(n) \cdot \log 2^{f(n)}) = O(f^2(n))$

### Hierarchy Theorem

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

其他  
即空间少, 就可以判定语言

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

	" $M_1$ "	" $M_2$ "	" $M_3$ "
$M_1$	1		
$M_2$		-1	
$M_3$			0
$\vdots$			
$D$	-1	+1	-1

会停机, 且  $space < f(n)$

可以保证性质 2.

D = on input "M"

$O(f(n))$

1. Let  $n = |"M"|$
2. compute  $f(n)$
3. run M on "M" for  $c^{f(n)}$  steps
  - 3.1 if M does not halts in  $c^{f(n)}$  steps, reject
  - 3.2 if M ever uses more than  $f(n)$  space, reject
4. if M accept "M"
5. reject
6. if M reject "M"
7. accept

technical conditions:  
 $f(n)$  can be computed in  $f(n)$  space.

for  $c^{f(n)}$  steps  
→ 不保证停机

$f(n)$  ?

↓  
不在  $O(f(n))$  表中

### 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  $O(f(n))$  time.
- (2) cannot ... ..  $O(\frac{f(n)}{\log f(n)})$  time

较少的 时间要提高  $\log f(n)$  才能有用

proof: D (1), decides some language A in  $O(f(n))$  time

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

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

D = on input "M"

1. Let  $n = |"M"|$
2. compute  $f(n)$
3. run M on "M" for  $\frac{f(n)}{\log f(n)}$  steps
4. if ...

technical condition  
 $f(n)$  can be computed in  $O(f(n))$  time.

→ 要维持一个 counter: 最后有  $\log f(n)$  长.  
每次 +1. 需要  $\log f(n)$  steps  
# steps:  $\log f(n) \cdot \frac{f(n)}{\log f(n)} = f(n)$

$\Rightarrow P \neq EXP$  (由上定理可知)