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Finite Automata

A deterministic finite automata is $M = (Q, \Sigma, \delta, q_0, F)$

Q : finite set of states

\emptyset : empty set

Σ : finite set of symbols

ϵ : empty string

δ : a set of transition function $Q \times \Sigma \rightarrow Q$

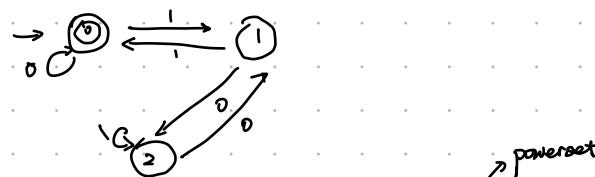
q_0 : start state

F : set of final states

Σ^* : set of all finite strings of symbols from $\Sigma = \{\epsilon, 0, 1, 10, 100, \dots\}$ if $\Sigma = \{0, 1\}$

$\hat{\delta}: Q \times \Sigma^* \rightarrow Q$ $\hat{\delta}(q, \epsilon) = q$ $\hat{\delta}(q, x\alpha) = \hat{\delta}(\hat{\delta}(q, x), \alpha)$

for input divisible by 3 - $v(x\alpha) \bmod 3 = (2 \cdot v(x) + \alpha) \bmod 3 = (2 \cdot v(x) \bmod 3 + \alpha)$



NFA: $N = (Q, \Sigma, \delta, q_0, F)$ $\delta: Q \times \Sigma \rightarrow \mathcal{P}(Q)$

Acceptance: is there a legal sequence of moves from q_0 to $q \in F$

A NFA N accepts $x \in \Sigma^*$, starting with q_0 , N has a legal sequence of moves following q_0 to some state $q \in F$

Anything can be expressed by DFA can be also expressed by NFA

Theorem: every NFA accepts a language also accepted by DFA

$$\forall \text{NFA } N \exists \text{DFA } M \text{ st. } L(M) = L(N)$$

proof: Define a DFA M $M = (Q_M, \Sigma_N, \delta_M, \{q_0\}, F_M)$ $F_M = \{S \subseteq Q \mid S \cap F_N \neq \emptyset\}$

$$\delta_M: Q_M \times \Sigma = Q_M \quad (S \subseteq Q, a \in \Sigma) \rightarrow \bigcup_{q \in S} \delta(q, a)$$

By an easy induction,

$\delta_M(\{q_0\}, x)$ is the subset of all $q \in Q$ reachable by legal sequence of move N

Def: A subset $A \subseteq \Sigma^*$ is called a regular language if it is the set of steps accepted by some DFA/NFA

Theorem: if L_1 & L_2 are regular, $L_1 \cap L_2$ is also regular

proof: if $L_1 = L(M_1)$ $L_2 = L(M_2)$

$$\text{def } M = (Q_M \times Q_{M_2}, \Sigma, \delta = ((q_1, q_2), a) = (\delta^1(q_1, a), \delta^2(q_2, a)), F = F_1 \times F_2)$$

if L is regular L^c is also regular

def $F = F^c$ (reverse the final/normal states) \Rightarrow does not apply for NFA since its acceptance condition, works for DFA

if L_1 and L_2 are regular, $L_1 \cup L_2$ also regular

create a NFA with start state connect to both DFAs.

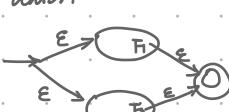
if L_1 regular, L_1^* is also regular

create NFA with ϵ -move, new start state connect to old q_0 , now $q_0 \in F$ with ϵ -move from all $q \in F$

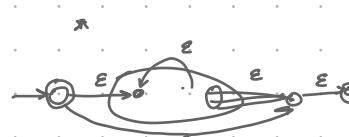
If L_1, L_2 regular $L_1 L_2$ is also regular.

create NFA with ϵ -move,

Union



Concat

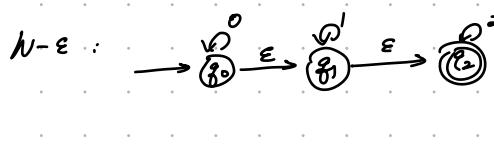


NFA with ϵ -move

$$N_E = (Q, \Sigma, S, q_0, F)$$

$$\delta = Q \times (\Sigma \cup \{\epsilon\}) \rightarrow P(Q)$$

ϵ -closure: the ϵ -closure of a state $q \in Q$ in N_E is all states reachable by 0 or more ϵ -move alone.



$$\begin{array}{c} \delta \text{ } 0 \text{ } 1 \text{ } 2 \text{ } \epsilon \\ \hline q_0 \text{ } q_0 \backslash \text{ } \backslash \text{ } q_1 \\ q_1 \text{ } \backslash \text{ } q_1 \text{ } \backslash \text{ } q_2 \\ q_2 \text{ } \backslash \text{ } \backslash \text{ } q_2 \end{array}$$

$$\epsilon\text{-closure}(q_0) = \{q_0, q_1, q_2\}$$

$$\{q_1\} = \{q_1\}$$

$$\{q_2\} = \{q_2\}$$

NFA (without ϵ -move)

$$f: Q \times \Sigma \rightarrow P(Q) \quad (q, a) \mapsto \epsilon\text{-closure}(\delta(q, a)) = \bigcup_{q' \in \delta(q, a)} \epsilon\text{-closure}(q') = \epsilon\text{-closure} \left[\bigcup_{q' \in \epsilon\text{-closure}(q)} \delta(q', a) \right]$$

By induction on $n \geq 1$ & $w \in \Sigma^*$, μ_n starting with q_0 , under w , can reach exactly same set of states in N .

DFA $\xrightarrow{\text{can be simulated}}$ NFA $\xrightarrow{\text{special case}}$ NFA_E

Def: a set $L \subseteq \Sigma^*$ is called regular if it is accepted by a DFA (NFA, NFA-E)

Regular Expression

\emptyset empty set if r, s are regular expression, so is

ϵ empty string

$a \text{ } \forall a \in \Sigma$

$$(r+s) \quad L(r) \cup L(s)$$

$$(r \cdot s) \quad L(r) \cdot L(s)$$

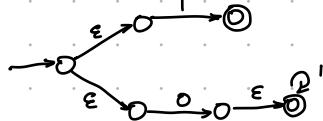
$$r^* \quad L(r)^*$$

$$L^* = \epsilon x_1 \dots x_n \mid \begin{cases} n \geq 0 \\ x_i \in L \end{cases}$$

$$= \bigcup_{i \geq 0} L^i, L^0 = \{\epsilon\}, L^{i+1} = L^i \cdot L$$

Convert RE to NFA with ϵ

example: $01^* + 1$



Given by DFA $M = (Q, \Sigma, S, q_0, F)$, want to capture all strings from q_0 to F .

$\forall f \in F$: if have $R_{q_0, f}$ as a regular exp that capture all strings that go from q_0 to f in M .

$$|I| = R_{q_0, f}, R_{q_0, f_1}, \dots$$

Base case: $f = q'$, what are the strings from q to q' for 0 steps $\Rightarrow \epsilon$ -string

the regular exp for all strings of length ≤ 1 can be written:

$$R_{qf} = \begin{cases} \epsilon & \text{if no self loop} \\ \epsilon + a + b & \text{otherwise, say it has loops labeled by } a \text{ & } b \end{cases}$$

now we have $q = q'$ if there is only 1 step, no ϵ for DFA

$$R_{qq'} = \begin{cases} \emptyset & \text{if } q \text{ direct transition} \\ a & \text{for every transition from } q \text{ to } q' \text{ labeled by } a \\ a+b & \dots \end{cases}$$

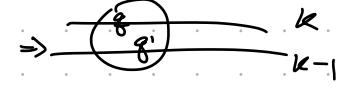
for length n , as we have how to express 1, it recursively sub 1 and back to 1

but it doesn't work as we don't have a single string

For every k $0 \leq k \leq n$ Consider [All strings that (R_{ij}^k) lead M from q_i to q_j passing through only state in $\{q_1, q_2, \dots, q_k\}$ (never above k ! start is ok)]

Intuition: if k raise to n , then problem solved

Base case: $k=0$, q_i to q_j without going through any intermediate step ($\#$ of step ≤ 1)



$$R_{ij}^k = R_{ij}^{k-1} + R_{ik} R_{kk} R_{kj}^k$$

\uparrow loop $\hookrightarrow k$ is last visit

before that all intermediate states $\leq k-1$

DFA

NFA

NFA/ ϵ

Regexp

subset construction

↳ all NFA are simulated
with DFA

dynamic programming

↳ start with DFA and
try to express by RegRNot regular: sets in Σ^* cannot be expressed by a DFA . to prove non-regular \Rightarrow Pumping Lemma

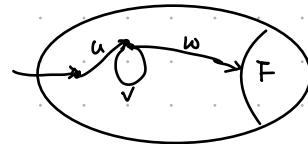
Pumping Lemma for regular language.

for every regular language L , accepted by DFA, there exist an integer $n \geq 1$ such that, for every $x \in L$, with length $|x| \geq n$, there exist a decomposition $x = uvw$ such that $|uv| \leq n$, $|v| \geq 1$, $\forall i \geq 0$ $uv^i w \in L$

if L is regular, there is $n \geq 1$, $x \in L$ $|x| \geq n$ (pick any $x \in L$) win the game by showing L is non-regular

$$L = \{a^n b^n \mid n \geq 1\}$$
① for every $n \geq 1$, pick $a^n b^n \in L$ ② for every decomposition of $x = uvw$ with $|v| \geq 1$, $|uv| \leq n$ v must be a
the resulting $uv^i w$ for $i \geq 2$ not in L

Proof of Pumping Lemma

• prove L is regular so \exists DFA M $L = L(M)$ • Let M has n states $\forall x \in L(M)$ $|x| \geq n$ • x will see $n+1$ occurrence of states \Rightarrow same state repeated• $x = uvw$ and as v is looping, after $v \rightarrow v^i x \in L$ for $i \geq 0$ 

Strong form of Pumping Lemma

 \forall reg $L \exists n \geq 1 \forall x = x_1 x_2 x_3 \in L$ with $|x_1| \geq n \nexists$ decompose $x_2 = uvw$, $|v| \geq 1$ s.t. $\forall i \geq 0$, $x_1 u v^i w x_3 \in L$ $L = \{n \mid n \text{ has same # of 0's and 1's}\}$ if $\forall n \geq 1$ consider $0^n 1^n$, & decomposition with $|uv| \leq n$ $|v| \geq 1$, it must be that both $u, v \in 0^*$
 $v \in 0^+$, then $uv^2 w$ has more 0 than 1another way: $L_1 \cap L_2$ are also regular if L_1, L_2 regular $\hookrightarrow L_1 = L_2 = 0^* 1^* \quad L_1 \cap L_2 = 0^n 1^n$ $\{ww \mid w \in (0+1)^*\}$ $\forall n \geq 1$ consider $0^n 1^n$ & decomposition uvw with $|uv| \leq n$ $|v| \geq 1$, v must be in 0then $uv^2 w \Rightarrow 0^{n+1} 1^n \notin L$ $\{1^n \mid n \geq 1\} \quad cn + 1 - n^2 = 2n + 1 \rightarrow \infty$ as $n \rightarrow \infty$ $\nexists n \geq 1$ pick 1^n , & decomposition uvw $|uv| \leq n$ $|v| \geq 1 \Rightarrow 1^{n+1}v \mid |v| \leq n$, $|v|$ need to be at least $2n+1$ $L = \{a^n \mid n \text{ is a prime}\} = \{a^2, a^3, a^5, a^7, a^11, a^{13}, \dots\} \quad \pi(n) \approx \frac{n}{\ln n} : n\text{-th prime} \approx n \log e^n$ we will pick $p > n$ since infinite many prime, & decomposition uvw $|uv| \leq n$ $|v| \geq 1$ a $P+k-j$ $k=|v|$ need to show $P+k-j$ is not prime j could be P $\Rightarrow P+k-j = P+k-p = P(k+1)$ p! trick: $L = \{w \in 1^* 2^* \mid \#_1(w) \neq \#_2(w)\}$ $\forall n \geq 1$, pick $1^n 2^{m n!}$ for decomposition $x = uvw$, v must be 1

$$x' = 1^{n-|v|} 1^{|v|-1} 2^{n+n!} = 1^{n-|v|+i-1} 2^{n+n!} \text{ for } i = 1 + \frac{n!}{|v|}, x' \notin L$$

Equivalence relation



$R_m \quad x \equiv_m y \text{ iff } \delta(q_0, x) = \delta(q_0, y)$

$R_L \quad x \equiv_{RL} y \text{ iff } \forall z \in \Sigma^* \quad xz \in L \Leftrightarrow yz \in L$

Σ^* finite piece \Rightarrow since finite states.

If 2 points are from same pieces, then $R_m = R_L$

Equivalence relation

① identity

② transform $x = y \quad y = x$

③ $x = z \quad y = z \quad x = y$

Myhill - Nerode Theorem

Def DFA from R_L {the space are set of equivalent class of R_L , &

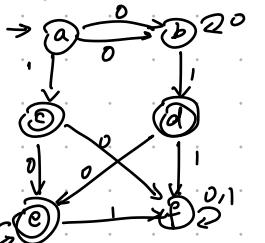
$$\begin{cases} \delta([x], a) = [x a] \\ q_0 = [\epsilon] \quad \delta([\epsilon], a) = 0 \\ F = \{[x] \mid x \in L\} \end{cases}$$

\hookrightarrow not working since F is not finite!

\hookrightarrow is regular iff # of equivalent class is finite.

\hookrightarrow unique DFA exist for regular language

\hookrightarrow equivalence class of R_L partition Σ^* in to chunks



$$\begin{aligned} CA &= (00)^* & C_b &= 0(00)^* 0 \text{ or } (00)^* 0 \\ Cd &= 0(00)^* 1 & Ce &= (00)^* 1 \\ Ce &= (00)^* 1 0 + (00)^* 0 1 0 0^* \text{ cf } (Ce + Cd + Ce) / (0 + 1)^* \\ &= 0^* 1 0 0^* \end{aligned}$$



Minimizing DFA

① make every pair (p, q) $p \in F$ $q \notin F$

② $\forall a \in \Sigma \quad \forall (p, q)$ not marked yet, if $(\delta(p, a), \delta(q, a))$ is already marked, mark it.

\hookrightarrow if witness exist to distinguish 2 states

\hookrightarrow repeat, stop when go through all unmark without adding.

• prove correctness of terminate

\hookrightarrow marks should be separated by induction

\hookrightarrow not marked are related R_L since xz, ye one in final state, the other not

if they are separated by empty string, they should be marked in first process

\hookrightarrow so distinguisher is not ϵ

$\hookrightarrow x$ ends in q ,

y ends in q' , (q, q') unmarked at the end

Induction: $\forall z \in \Sigma^* \quad |z| = n \quad xz \in L \Leftrightarrow yz \in L$

$\Rightarrow \forall z' \in \Sigma^* \quad |z'| \leq n+1 \quad z' = az \quad |z| = n \quad \delta(q, a), \delta(q', a) \text{ cannot be distinguished by length } n$

4. y integer $d \mid n$ ($0, 1, 2, \dots, n-1$)
 $\{0, d, 2d, \dots, (\frac{n}{d}-1)d = n-d\}$ they all have n/d elements, have d classes
 $\{1, d+1, d+2, \dots, (n-d)+1\}$

5. take any a is relatively prime to $n \mid a \mid n$

$$\{a \pmod n, a^1 \pmod n, \dots, a^t, a^s \equiv a^t \pmod n\}$$

$$a^s \equiv a^t \pmod n \quad a^{s-t} = a^{t-s} \pmod n \quad t > s$$

$$\chi \cdot (a^s \equiv a^t \pmod n) = 1$$

$\exists x, y$ relatively prime

$$x \cdot a = y \cdot n = 1 \quad x \cdot a \equiv 1 \pmod n$$

$$\text{def } x \equiv y \text{ if } \exists i \quad x = y \cdot a^i \pmod n$$

for $x, y \perp n \quad \{x, x \cdot a, x \cdot a^2, \dots, x \cdot a^{s-1}\}$ if y is in set it is equivalence class x

$$s \mid \Phi(n) = \# \text{ of integer } k \perp n$$

if n is prime $\Phi(p) = p-1 \quad a \in \{1, 2, \dots, p-1\} \quad a^s \equiv 1 \text{ when } s \mid p-1 = k \cdot s$

$$a^{p-1} = (a^s)^k \equiv 1 \pmod p \quad \text{Fermat theorem}$$

Chinese remainder theorem

$$p, q \text{ are distinct primes. } \Phi(pq) = (p-1)(q-1)$$

PRIME is not Regular

pick prime $p = V(x) > 2^n \quad |p| > n$

$$x = uvw \quad |uv| \leq n \quad |v| \geq 1 \quad v(u) \cdot 2^{|v|+|w|} + v(w) \cdot 2^{|w|} + v(v) \Rightarrow \text{value of string}$$

pump $\Phi(v(x)) = v(u) \cdot 2^{|v|+|w|} + v(v) \cdot 2^{|w|} \cdot (1 + 2^{|v|} + \dots + 2^{|v|(c_i-1)}) + v(w)$

$$= v(u) \cdot 2^{|w|} \cdot (2^p)^{|v|} \quad \hookrightarrow \frac{\alpha p - 1}{\alpha - 1}$$

$$v(w) + v(v) \cdot 2^{|w|} \cdot 1 + v(u) \cdot 2^{|w|+|v|} = \alpha \cdot p \quad \Rightarrow x = p \cdot \text{which is a prime} \Leftrightarrow 0 \pmod p$$

find something bigger than p but divisible by $p \Rightarrow$ PRIME is not regular

RSA : p, q are distinct primes, $x \in \mathbb{Z}_{pq}^*$

Enc : select a key e relatively prime to $\Phi(pq)$

To send x : compute $x^e \pmod{pq}$

Dec : receiver has decrypt key d (secret) s.t. $e \cdot d \equiv 1 \pmod{\Phi(pq)}$

$$\text{take } x^e \rightarrow (x^e)^d = x^{e \cdot d} \equiv x^{(p-1)(q-1)} = x$$

Context free language

$\{0^n 1^n \mid n \geq 1\}$ is not regular language, but Context-free

$S \rightarrow 0S1 \mid 01 \mid \epsilon$ variable \rightarrow terminals

{ production/substitution rules : symbol & string separated by arrow
Starting variable: first line left most

Derivation: write down start variable, substitute until no variable remain

↳ strings generated in this way \Rightarrow language of grammar L(G) \rightarrow language of grammar G.

Any language can be generated by context free grammar \Rightarrow CFL

Context-free Grammar is a 4-tuple ($V \Sigma R S$)

1. V is a finite set called variables
2. Σ is a finite set, disjoint from V , terminals
3. R is finite set of rules, each rule: variable \rightarrow string of variable and terminal
4. $S \in V$, start variable.

$\rightarrow P$: finite set of predictions
A prediction is a rule of form
 $A \rightarrow \alpha \in V \cup \Sigma^*$

PFA \rightarrow CFG

- ① Variable R_i for each state q_i
- ② Rule $R_i \rightarrow aR_j$ if $\delta(q_i, a) = q_j$
- ③ $R_i \rightarrow \epsilon$ if $q_i \in F$
- ④ R_0 as start if q_0

Ambiguity: a grammar can generate the same string in more than one ways / 2 diff derivation tree

↳ some CFL can only be generated by ambiguous grammar \Rightarrow inherently ambiguous

$$E \rightarrow a1b \mid E+E \mid c \mid E \cdot E$$

$$\begin{aligned} E &\rightarrow E + T \mid T \\ T &\rightarrow T \times F \mid F \\ F &\rightarrow (E) \mid a \mid b \end{aligned}$$

proof of un-ambiguity

def $y \sqsubseteq x$ prefix $\xrightarrow{\text{def}} y \sqsubseteq x$ for $y = e/x = y$ included = proper prefix $e \neq y \sqsubset x$

lemma ① $E \xrightarrow{*} x \in \Sigma^*$ $\Sigma = \{a, b, c, *, \dots\}$

then $|x| \geq 1$ & $N_C(x) = N_C(x)$ & $\forall y \sqsubseteq x \quad N_C(y) \geq N_C(y)$ \Rightarrow left \geq right

② $T \xrightarrow{*} x \in \Sigma^*$

then $|x| \geq 1$ & $N_C(x) = N_C(x)$ embedded in sequence

unique: $\forall y \sqsubseteq x \quad N_C(y) \geq N_C(y) \geq \text{if } x = \underline{\underline{\underline{x}}} + \underline{\underline{\underline{x}}} \text{ then } N_C(y) > N_C(y)$

③ if $F \xrightarrow{*} x \in \Sigma^*$

unique: if $|x| \geq 1$ & $y \sqsubseteq x \quad N_C(y) > N_C(y)$

And in all 3 cases, x doesn't start or end in * and +

proof: by induction on i \xrightarrow{i} (steps of derivation)

$F \xrightarrow{i} x$ if $|x| \geq 1$

first step must be $F \xrightarrow{*} (E) \xrightarrow{i-1} (y) = x$

by induction what could be produced in E is balanced

$T \xrightarrow{i} x$ if $|x| \geq 1$

T can go $T \times F$ or F :

$\hookrightarrow \dots$

Theorem: This G is unambiguous

proof: Let $\overline{x} \xrightarrow{*} \overline{y}$. if $|x| = 1$ $F \xrightarrow{*} a1b$ game over. unique

suppose $|x| > 1$ must use $F \xrightarrow{*} (E)$ front step: $F \xrightarrow{*} (E) \xrightarrow{i-1} (y) = x$ & suppose $F \xrightarrow{*} x$ \therefore unique

Let $T \xrightarrow{*} x$ ($T \xrightarrow{*} x$) if $|x| = 1 \rightarrow T \xrightarrow{*} F \xrightarrow{i-1} x$ (a,b) if $|x| > 1$, $T \xrightarrow{*} T \times F \xrightarrow{i-1} x$ $\hookrightarrow \underline{\underline{\underline{y}}} \xrightarrow{i-1} x$ y: proper prefix, $N_C(y) > N_C(y)$

but it is from T, $N_C(y) = N_C(y)$

contradiction

!!

Pushdown automata like NFA with stack

- can write symbols on stack and read them back later
- stack has unlimited space
- Deterministic and nondeterministic pushdown automata are not equivalent in power.

A pushdown automata is a 6-tuple $(Q, \Sigma, T, \delta, q_0, F)$ where Q, Σ, T, F are finite sets.

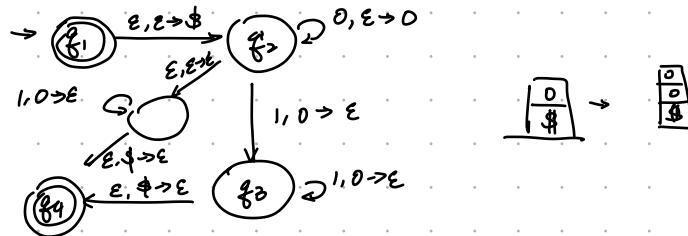
1. T is stack alphabet : stack is a finite string but with unlimited space.

$$\delta : Q \times \Sigma \times T \rightarrow P(Q \times T)$$

push: $\delta(q, a, \epsilon) \Rightarrow (q', B)$ pop: $\delta(q, a, A) \Rightarrow (q', \epsilon)$

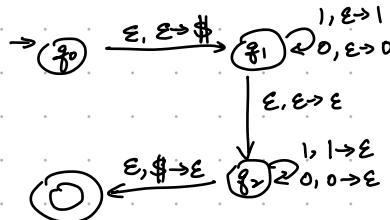
A language is CFL iff some pushdown automata recognize it

PDA for $\{0^n 1^n \mid n \geq 0\}$



Def LCP: $\{w \in \Sigma^* \mid \exists \text{ a sequence of legal move from } q_0 \text{ consuming all symbols of } w \text{ & end in } q \in F\}$
 L or, end up with an empty stack.

$\{wwR \mid w \in \Sigma^*, \Sigma^*\}$



$\{(a^i b^j c^k \mid i, j, k \geq 0 \text{ (i=k or j=k)}\}$

$S \rightarrow S_1 \mid S_2$

$S_1 \rightarrow S_1 a \mid S_1 b$

$S_1' \rightarrow a S_1' b \mid \epsilon$

$S_2 \rightarrow a S_2 c \mid S_2'$

$S_2' \rightarrow S_2' c \mid \epsilon$

Chomsky Normal Form

In a c.f.g. G if every production is of the form

$A \rightarrow BC \quad S \rightarrow \epsilon \quad A, B, C \text{ are not necessarily distinct}$

$A \rightarrow a$

If a variable A can produce ϵ , A is called nullable. $A \xrightarrow{*} \epsilon$

Decide the set of all $V' \subseteq V$ s.t. $A \in V' \Leftrightarrow A$ is nullable.

Given a grammar G & $x \in \Sigma^*$, whether $x \in L(G)$ decidable \Rightarrow PDA is not deterministic

$$L(G) = L(G') \text{ in Chomsky N.F.}$$

Dynamic program algorithm:

aba... \xrightarrow{x} # of contiguous subsequences : $1 \leq i \leq j \leq n$.

$S \xrightarrow{*} x$ if $x = \epsilon$ nullibility of $S \Rightarrow$ decidable

Suppose $x \neq \epsilon$ $n = |x| \geq 1$

n rounds : $j = 1, 2, \dots, n$

at j -th round, I'll collect all variables that can derive $x_{1j}, x_{2j}, \dots, x_{(j+1)-1}$

for $i=1$ to n do: $V_{i,j} = \{A \mid A \rightarrow a \in P \text{ & } i\text{th symbol of } x \text{ is } a\}$

for $j=2$ to n do:

length j contiguous subsequence

$S \rightarrow AB \mid BC$
 $A \rightarrow BA \mid a$
 $B \rightarrow CC \mid b$
 $C \rightarrow AB \mid a$

for $i = 1$ to $n-j+1$

begin $V_{ij} = \emptyset$

for $k=1$ to $j-1$

break up all possibilities of substring length $< j$ see if there is a rule

$$V_{ij} = V_{ij} \cup \{ A \mid A \rightarrow BC \text{ & } P \in B \in V_{ik} \}$$

	b	a	a	b	a
1		a	a	b	a
2	B	AC	AC	B	AC
3	\emptyset	\overline{B}	\overline{B}	B	\emptyset

$? \rightarrow BA \rightarrow ba$

$BC \rightarrow ba$

$L(C_1) \cap L(C_2)$ is CFL

$L(C_1) \setminus L(C_2)$

$L(C_1) \cap \overline{L(C_2)}$

$L(C_1) \setminus L(C_2)$

1. Union $L(C_1) \cup L(C_2)$ is CFL

2. $L(\bar{C})$ is generally not CFL \Leftarrow de Morgan's law

3. Intersection is not generally CFL \Rightarrow 2 stack might be conflict, example: $a^n b^n c^n$ is not CFL

4. Concatenation is CFL \Rightarrow add a new start variable

$\hookrightarrow \#$ is also CFL

5. if C_1 is c.f.g and M is DFA, $L(C_1) \cap L(M)$ is c.f.l. M doesn't have a stack

6. \downarrow (not diff) $L(C_1) \setminus L(C_2)$ is c.f.l $\Rightarrow L(C_1) \cap \overline{L(C_2)}$

proof: we can construct a PDA, the PDA will process input and track states of DFA & follow stack operations of PDA

Pumping Lemma for CFL

for every cfl $L \exists$ an integer $n \geq 1$, for every $x \in L$ $|x| \geq n$

\exists a decomposition of $x = uvwyz$ $\quad ① |v,y| \neq 0 \quad ② |vw|y| \leq n$

$\forall i \geq 0 \quad uv^iw^yv^z \in L$

if $\{a^n b^n c^n\}$ c.f.l

$\exists N \geq 1$ satisfy that PL. for cfl. and yet condition $a^n b^n c^n \in L$ has length $\geq N$

for any decomposition $a^n b^n c^n = uvwyz$ have $|v,y| \geq 1 \quad |vw|y| \leq n$

\hookrightarrow each part of $v \& y$ cannot contain more than one type of symbol, else $i=0$ gives $x \notin a^* b^* c^*$

v and y contains at most 2 type of symbols

\hookrightarrow at least 1 type is not present, $uv^iw^yv^z$: the missing one type is not increasing, but the other 2 are increasing

prove pumping lemma

Assume $L = L(C_1)$ C_1 in CNF

A is a child of A (appear in a path)

\hookrightarrow if path length is $> \#$ of variable

\hookrightarrow the path exist if leaf is big enough

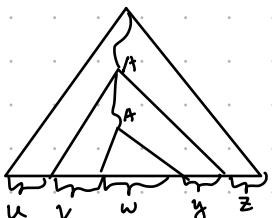
By C_1 being CNF, the tree is a binary tree where every "internal node" has a children (> 1 step from leaf)

if # of leaves $> 2^{|V|} \Rightarrow$ # of variable \Rightarrow some path from root to just above leaf have length $> \#$ of variable

some variable appears at least twice

v and y cannot be both ϵ as $|v,y| \neq 0$

proving $|vw|y| \leq n$ since there is same variable appearing twice under " A "



Turing Machine

A TM is a 7-tuple $(Q, \Sigma, T, \delta, q_0, \text{acc}, \text{ rej})$, Q, Σ, T are all finite sets

- 1. Q is the set of states
- 2. Σ is the input alphabet, no \sqcup
- 3. T is the tape alphabet, $\sqcup \in T$, $\Sigma \subseteq T$
- 4. $\delta: Q \times T \rightarrow Q \times T \times \{\text{L}, \text{R}\}$
- 5. q_0 is the start state $q_0 \in Q$, acc is accept state rej is reject state, $\text{acc} \neq \text{rej}$
- C_i yields C_a if C_i goto C_a in 1 step.

left move: $uq_i b v$ yields $uq_j a c v$ on $\delta(q_i, b) = (q_j, a, L)$

right move: $uq_i b v$ yields $u a c q_j v$ on $\delta(q_i, b) = (q_j, c, R)$

if on the head: left: $q_i b v$ yields $q_j c v$

right: $b v q_i = b v q_j \sqcup$ yields $b v c q_j$ on $\delta(q_i, \sqcup) = (q_j, c, R)$

$\hookrightarrow \Gamma^* Q T^*$  $\sqcup \dots$ tape is one-side infinite

$uq_i a c$ has next step iff $u \neq \epsilon$

\vdash^* : 0 or more steps

$u\sqcup, u'$ could $= \epsilon, d \in \Gamma$

• Turing Machine have finite input with infinite tape length (the # of ' \sqcup ' at right is definite)

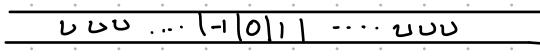
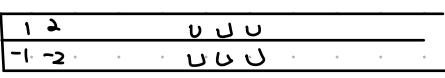
Turing Machine accepting: $L(M) = \{w \in \Sigma^* \mid q_0 w \sqcup \sqcup \text{ / } q_0 w \vdash^* u \text{ accept } v \text{ for some } q_{\text{acc}} \in Q \text{ acc's}\}$

Not finite definition:

A set S is NOT finite iff there is 1-1 correspondence of S & a proper subset $S' \subsetneq S$

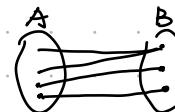
$\{1, 2, 3, 4, \dots\} \cong \{\star, 3, 4, 5, \dots\}$

• For a turing machine, one-way finite is the same as 2 way finite

\Rightarrow 
 \hookleftarrow 

just adjust the alphabet

Any set S that there is a 1-1 correspondence with \mathbb{N} is called countable infinite

• onto: $f: A \rightarrow B$  onto 

• cardinality: size of a set

A set is countable if it's either finite or has the same cardinality with \mathbb{N}

Uncountable infinity cannot put into 1-1 correspondence with set of \mathbb{N} - "too large"

• the set \mathbb{R} is uncountable \Rightarrow prove by diagonal

for a set \mathbb{R} we can have a list of all r in \mathbb{R} in range $[0, 1]$

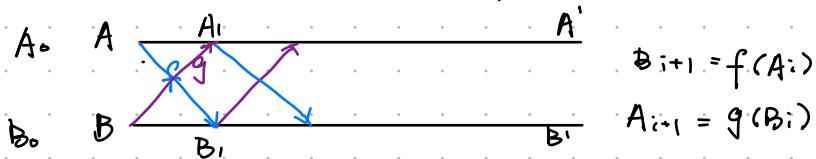
$r_1: 0.345\dots$ alter the bit on diagonal line and form a new number

$r_2: 0.478\dots$

$r_3: 0.251\dots$

$r_4: 0.1793\dots$

Cardinality : $\exists 1-1$ correspond $A \cong B$ $|A| = |B|$



$$A' = \bigcap_{i>0} A_i \quad \text{if } A_1 = A_0 \quad g \text{ does it} \quad A_1 \neq A_0 \quad B_1 \neq B_0 \\ B' = \bigcap_{i>0} B_i \quad B_1 = B_0 \quad f \text{ does it}$$

Suppose $x \in A'$ so it must be in one of A_i :

For $x \in A = A_0$ if $x \neq A'$ \exists maxi $x \in A_i - A_{i+1}$ $x \neq A_{i+1}$

if x is even, do f : map x under f to go forward

if x is odd, do g^{-1} go backward

if $x \in A'$, take $f(x) \rightarrow B'$

say a set has linearly / total order (for $\exists x \neq y$, either $x < y$ or $x > y$)

A linear order is called a well-order if following are true

every non-empty set $S \subseteq A$, $S \neq \emptyset$, S has a minimum element. \Rightarrow must have a smallest/base case

\hookrightarrow not for all \mathbb{N} , but for all positive number, also for rational number $\rightarrow (0, 1)$ not work but $[0, 1]$ works

Order $0, 1, 2, 3, \dots, \omega$

$$1+\omega = \omega, \omega+1, \omega+\omega, \omega^\omega, \dots$$

$$\beta_0(x) = x+1 \quad \beta_1(x) = 2+x \quad \beta_2(x) = 2 \cdot x \quad \beta_3(x) = 2^x \quad \beta_4(x) = 2^{2^x} \quad \beta_5(x) = 2^{2^{2^x}} \\ \beta_1(x^+) = \beta_0(\beta_1(x)) \quad \beta_2(x^+) = \beta_1(\beta_2(x)) \quad \dots \quad \beta_4(x^+) = \beta_3(\beta_4(x)) \quad \dots \text{ induction}$$

Primitive recursive functions

1. $\lambda x. [x+1]$ success function π^+

2. $\lambda x_1 \dots x_n [m]$ $\forall n, m \text{ inf}$

3. $\lambda x_1 \dots x_n [x_i]$ $\forall n \geq 1 \quad 1 \leq i \leq n$ "identity function"

4. Composition if g_1, \dots, g_n, h are "primitive" then so is $f(x_1 \dots x_n) = h(g_1(x_1 \dots x_n), \dots, g_n(x_1 \dots x_n))$

Accumulation is not captured by scheme table \Rightarrow we cannot enumerate all computable things

\hookrightarrow but Turing machine are countable. Total functions will never work \Rightarrow DIA on primitive recursion

so Church added μ operator

$f(x_1 \dots x_n) = \mu z \text{ (minimum } z \text{ such that) } I g(x_1 \dots x_n, z) = 0]$

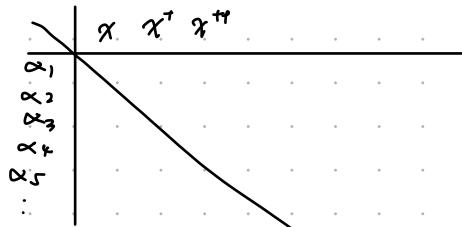
find smallest counter example. if not exist, z is undefined (will not halt)

Thm: the set of (partial) recursive functions. using 1-6 is exactly the same as Turing Machine computable.

\hookrightarrow permutatively recursive function

Accumulation function

$\rightarrow A(x) = \beta_x(x) \rightarrow \text{diagonal function}$



Turing Decidability & Recognizability

Σ^* : set of finite length string, total # of string. Infinite.

Def a subset $L \subseteq \Sigma^*$ is Turing recognizable i.e.

• \exists TM. M s.t. $L = L(M)$, for $w \notin L$, M will NOT ACCEPT (might reject, might loop)

↳ for L^c is complement of L , L^c either rejects or loops in M , so we won't know if $L(m') = L^c$

Def a subset $L \subseteq \Sigma^*$ is Turing decidable (recursive)

$\exists \text{TM } M \text{ "total"} L(M) = L \text{ if on every input } w \in \Sigma^*, M(w) \text{ either halts on face } a_i \text{ or halts on face } b_j \text{ in finite steps.}$

Thm: L is recursive iff both L and L^c are r.e.

proof: \Rightarrow we can have a decider for $L \Rightarrow L$ is r.e.

flip the accept and reject $\Rightarrow L^c$ is r.e.

\Leftarrow for M_1 , $LCM_1 = L - M_2$, $LCM_2 = L^c$

Construct a M_3 : on input w

run one step on M_1 and one step on M_2

if M_1 accept, accept

if $M =$ accept, reject

- TM can be encoded uniquely into integer by ascii code.

M_i g_1 \neq g_2 ... \Rightarrow integer

↳ you can enumerate all TM code of $M_i \in \mathcal{M}_i$

$$A_{TM} = \{ \langle M_i, w \rangle \mid M_i \text{ accepts } w \}$$

Assume A_{TM} is decidable, $TM M^*$ is decider

① Design a TM M on input $x = \langle M_1 \rangle$

feeds $\langle M_1 \rangle, \langle M_2 \rangle$ to M^* , if $\begin{cases} M^* \text{ accept}, M \text{ loop} \\ M^* \text{ reject}, M \text{ accept} \end{cases}$

⑤ When we run input < M >, what happens:

↳ feed $\langle M, \langle M \rangle \rangle$ to M^* , if M^* accept, M loop \Rightarrow but $\langle M, \langle M \rangle \rangle \in A_M$, M should stop

M^* reject; M accept \Rightarrow but $\langle M, \langle M \rangle \rangle \in A_M$, M should loop and never halt.

↳ contradiction.

Church-Turing Thesis: Anything that can be computed is computable by TMs. Also state the limitation.

- Turing Machine algorithm = \rightarrow calculus functions

- Defines intuitive notion of algorithms

Examples: $A_{DFA} = \{ \langle B, w \rangle \mid B \text{ is DFA accepting } w \}$. A_{DFA} decidable.

CFG is decidable. proof: for Chomsky form, any derivation of w within $2n-1$ step

↳ for decider D, D runs every derivation within $2n-1$ step.

If $n=0$, list all derivations with one step

$E_{DFA} = \{ \langle B \rangle \mid B \text{ is a DFA } L(B) = \emptyset \}$. mark states, make all incoming link from marked state, check if goes marked

Undecidability

- $\overline{A_{TM}}$ is not decidable \Rightarrow partial decider exists. r.e. but not recursive
- HALT problem.

$$HALT_{TM} = \{\langle M, w \rangle \mid M \text{ on } w \text{ eventually halts}\}$$

Thm: $HALT_{TM}$ is not recursive / decidable.

proof: suppose we can have a decider D for $HALT_{TM}$

then we can construct a decider M' for A_{TM}

M' = on input $\langle \langle M \rangle, x \rangle$,
run D on $\langle \langle M \rangle, x \rangle$, if reject, reject
if accept, run M on x .

\hookrightarrow if we can decide $HALT_{TM}$, we can decide $A_{TM} \Rightarrow$ contradiction

Reducibility: A reduction is a way of converting one problem to another problem in such a way that a solution to the second problem can be used to solve the first problem.

$E\phi$ is undecidable: suppose $E\phi$ is decidable and have decider D , we can have following

TM M_1 = "on input x :
if $x \neq w$, reject; otherwise run M on w "

Then we can construct a decider for A_{TM} :

M' = "on input $\langle \langle M \rangle, w \rangle$:
run D on $\langle \langle M \rangle \rangle$, if accept, reject, if reject, accept."

Since M_1 only accept w if M accept w ; if M don't accept w $M_1 \in E\phi$

$REGULAR_{TM} = \{\langle M \rangle \mid M \text{ is a TM and } L(M) \text{ is a regular language}\}$

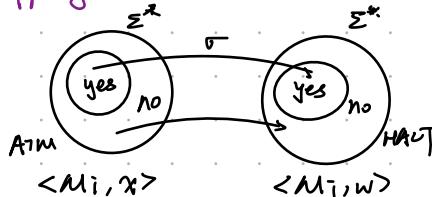
prove: suppose $REGULAR_{TM}$ is decidable. with D . we can construct following

then we can construct a M' for A_{TM}

M' = on input $\langle \langle M \rangle, w \rangle$, construct M_2 = "on input x , if x is in form 0^n1 ", accept,
otherwise run M on w "
if D accept M_2 , accept.

if M accept w then M_2 accept all other strings.

Mapping Reduce:



σ : a computable function in finite step

M_j : on input w , ignore w

Run x on M_j , if accept, halt

if loop/rej, loop

\Rightarrow if you can decide $HALT$

you can decide A_{TM}

Rice's theorem

$\{\langle M_i \rangle \mid PCL(L(M_i))\}$ is undecidable for non-trivial property of recursively enumerable set

P is about the language but not TM.

proof: P on r.e. set is non-trivial iff $\exists M_1, M_2$ s.t. $PCL(L(M_1)) \Rightarrow P(L(M_2))$

Suppose M_1 s.t. $L(M_1) = \emptyset$ and $\emptyset \notin P$

M_2 s.t. $L(M_2) \in P$

P is not decidable: if $\langle M_1, w \rangle \in A_{TM}$ then $L(M_1 \cup \{w\}) = L(M_2) \in P$
(& A_{TM} then $L(M_1 \cup \{w\}) = \emptyset \notin P$)

proof Rice's theorem:

① Define P

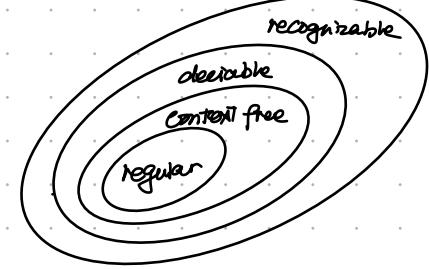
② Prove P

③ Prove if $L(M_1) = L(M_2)$ they both $\in P$

note: if P is trivial \Rightarrow might be decidable

P is expressed by PCP \Rightarrow r.e., trivial P

P: not r.e. \Rightarrow trivial P



Post Correspondence Problem

Given input $\{[\frac{t_1}{b_1}], [\frac{t_2}{b_2}] \dots [\frac{t_n}{b_n}]$ $t_i, b_i \in T^*$, question: is there a match?

PCP is undecidable: we need to prove this by introducing MPBP

Modified PCP: same instance, question: is there a sequence such that the first $i, \dots i_k \in \{1, \dots n\}$

$$\text{s.t. } i_1 = 1 \text{ & } t_{i_1} \dots t_{i_k} = b_{i_1} \dots b_{i_k}$$

Proof: $A_{TM} \leq M\text{PCP}$, we can construct M^cPCP from $M, w \Rightarrow$

$$M = (Q, \Sigma, T, \delta, q_0, \text{acc}, \text{ rej})$$

M will work as follows: for input from (M, w)

1. $[\frac{t_1}{b_1}] = [\frac{\#}{\# g_{0w} \dots w\#}]$
2. $\forall a, b, c \in T \quad \forall q, q' \in Q \quad q \neq q_{\text{rej}}$, if $\delta(q, a) = (q', b, R)$, then put $[\frac{qa}{bq'}]$ in P , put one $\exists a, b$
3. $\forall a, b, c \in T \quad \forall q, q' \in Q \quad q \neq q_{\text{rej}}$, if $\delta(q, a) = (q', b, L)$, then put $[\frac{cqa}{qb}]$ in P , put one $\exists c$, for $\exists a, b$
4. $\forall x \in T$, put $[\frac{x}{x}]$ in $P \Rightarrow$ everything in T
5. put $[\frac{\#}{\#}]$ in P
6. if the turing machine reach acc , put $[\frac{a_{\text{acc}}}{\text{acc}}], [\frac{\text{acc}\#}{\text{acc}}] \quad \forall a \in T$
7. $[\frac{\text{acc}\#\#}{\#}]$

To prove $M\text{PCP} \leq \text{PCP}$ if PCP solved then M^cPCP also

Let $[\frac{t_1}{b_1}]$ be instance in M^cPCP

$$t_1 = abcd \dots d \Rightarrow *a*b*c*d*\dots*d*$$

$$b_1 = abcd \dots d \Rightarrow *a*b*c*d*\dots*d*$$

def $\star t_f$: put $*$ in front of any element in t

$\star d$: put $*$ in front of any element in d , also right after

instance of M^cPCP $\rightarrow \left\{ \frac{\star t_1}{\star b_1 \star}, f_1 \geq 1, \frac{\star t_i}{b_i \star} \right\} \Rightarrow$ the only solution must start with $\frac{\star t_1}{\star b_1 \star}$

Turing decidable is closed under

- union
- concat
- star
- complementation
- intersection

Recognizable closed under

- union: execute M_1, M_2 individually \Rightarrow at least one accept
- concat: divide each input into 2 part non-deterministically and run
- star: divide w in non-deterministically into $w_1 \dots w_n$
- intersection: execute both
- homomorphism: on inputs consider all w . $h(w)=s$, run M on w , using merging to interleave with other M
- if $A \leq_m B$, B is regular, A could be not regular
- E_{TM} is not reducible to A_{TM} since A_{TM} is not r.e. if $E_{TM} \leq_p A_{TM}$ then $E_{TM} \in_p A_{TM}$
- if A r.e. $A \leq_m \overline{A}$, then A is decidable
- A r.e. iff $A \leq_m A_{TM}$
- $A_{TM} \leq_m \overline{A_{TM}}$
- if $A \leq_m B$, A is not r.e. B is not r.e.
- CFG \Rightarrow PCP to prove $L(G) \cap L(H) \neq \emptyset$

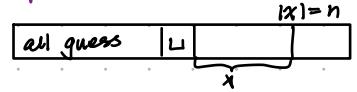
P : $L \in P$ iff \exists TM on any input x , $|x|=n$, M on x halts in $\leq p(n)$ steps where P is some polynomial

$x \in L \quad L = L(M) \Rightarrow M$ halts and accept on x in $p(|x|)$ steps

(poly time recursive)

$x \notin L \quad L = L(M) \Rightarrow M$ halts and reject on x in $p(|x|)$ steps.

NP : \exists TM M with 2 way infinite tape such that \exists input x , $|x|=n$. if $x \in L$, \exists a guess to let me verify that M accepts x (a guess is an assignment encoded in each cell to the left cell in TM M) the guess y , $|y| \leq p(n)$ s.t. $M(y \cup x)$ are in $P(n)$ stop and accept.
if $x \notin L$. If guess y , $|y| \leq p(n)$ $M(y \cup x)$ are in $P(n)$ stop and reject.



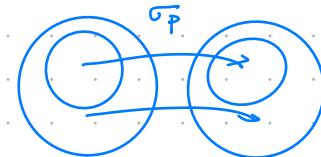
NP : can be verify in poly-time ; poly-time version of r.e.

\leq_P is poly-time version

NP -Complete: A decision problem is NP -Complete if $L \leq \Sigma^*$

① $L \in NP$.

② $\exists NP$ set $L' \leq_P L$



SAT x_1, x_2, \dots, x_n variables C_1, C_2, \dots, C_m each C_i is a clause

\hookrightarrow disjunction \vee with variable / negation is there an assignment of x_1, x_2, \dots, x_n , it takes $x_1, \dots, x_n \rightarrow \{0, 1\}$ that every clause satisfy $\Phi |_f = C_1 \wedge C_2 \wedge \dots \wedge C_m |_f = \text{True}$

Φ is a conjunction of disjunction of literals variable or its negation

Cook-Levin: every NP set $L(M)$ is reducible p-time to SAT

proof: a poly-time reduction for every $L(M)$ to SAT

$$M = (\mathcal{Q}, \Sigma, \Gamma, \delta, q_{acc}, q_{rej}, f) \quad x, \quad n = |x| \quad x = a_1 a_2 \dots a_n \quad a_i \in \Sigma$$

variables: In time stamp i , are you in state j (true or false)

time stamp 0: $\overbrace{\quad \quad \quad \quad \quad}^{p(n)}$ $\underbrace{| a_1 | \dots | a_n |}_{p(n)+1} \cup \dots \cup$

time stamp 1: same as 0, except not in $q_0 \rightarrow \delta(q_0, a_1) = (q', a', L/R)$

in $\leq p(n)$ steps

accept: after accept, all states goes to accept state

$$\text{variable } Q_{ij} \quad 0 \leq i \leq p(n) \quad 0 \leq j \leq r \quad Q = \{ q_0, \underbrace{q_1, q_2, \dots, q_r}_{acc}, \underbrace{q_{r+1}, q_{r+2}, \dots, q_{r+3}}_{rej} \} \quad |Q| = r+1 \quad T = \{ a_0 = \cup a_1, \dots, a_r \}$$

① $Q_{ij} = \text{true}$ iff at time i , M is at state j

② $H_{ij} \rightarrow$ at time i , where is my reading head (on tape) $-p(n) \leq j \leq p(n)+1$

③ A_{ijk} at time i , at time j , contains some symbol $a_k \quad k = 0, \dots, s$

Constraints: $Q_{i0} \vee Q_{i1} \vee \dots \vee Q_{ir}$ is true \rightarrow you must be in a state at time i

and $\neg(Q_{i0} \wedge Q_{i1})$ is true $\rightarrow \overline{Q_{i0}} \vee \overline{Q_{i1}} \dots \overline{Q_{i0}} \vee \overline{Q_{ir}} \Rightarrow$ for $\exists \overline{Q_{ij}} \vee \overline{Q_{ij}}$ is true ($0 \leq i \leq p(n)$) ($0 \leq j < j' \leq r$)

\hookrightarrow you are in exactly one state at a time $\quad [\overline{Q_{ij}} \vee \overline{Q_{ij'}}]$ is true

and

$H_{i-p(n)} \vee \dots \vee H_{i,p(n)+1} \rightarrow$ at any time i , in one of the leading position (on tape)

$\wedge \quad \bigwedge_{-p(n) \leq j \leq p(n)+1} [H_{ij} \vee \overline{H_{ij}}] \quad$ at all time, all cells contains exactly one symbol of T (same apply to A)

\hookrightarrow after all, for input a_1, a_2, \dots, a_n $a_i \in \Sigma$, the cell position $A_{0,i,1}$ at time 0, cell 1, have $a_{i,1}$ symbol

$A_{0,i,1} \wedge \dots \wedge A_{0,n+1,0} \wedge A_{0,0,0} \wedge \dots \wedge A_{0,n,n}$...

Assign $A_{0,-1}, \dots, A_{0,-p(n)}$ to make $\wedge Q_{0,1} \wedge Q_{0,0} \rightarrow$ If at time i , not in j , $\overline{H_{ij}} \wedge A_{ij,e} \rightarrow A_{i+1,j,e}$

$[H_{ij} \vee \overline{A_{ij,e}} \vee A_{i+1,j,e}] \quad$ if $x \in L$, \exists an computation of M on x of length $p(n)$ or less, satisfies all the clause in C = all restrictions

L \in NP iff \exists p-time predicate A, $x \in L \Leftrightarrow \exists y, |y| \leq \text{poly}(|x|)$, A(x,y) holds. P: problem solvable in poly-time

Decision problem: a decision problem consists a set of instance D and a subset $Y \subseteq D$ of yes-instances.

SAT is NP-Complete: every problem in NP is poly-time reducible to SAT

① SAT \in NP

② $\exists L \in NP, L \leq_M^P SAT$

• A generic NP set $\leq_M^P SAT \leq_M^P \exists SAT$

$\exists SAT$: SAT that accept every clause has 3 literals

proof: convert SAT to $\exists SAT$

$k=1$ for $C = \exists x_1 \exists C' = (x_1 \vee y_1 \vee y_2) \wedge (x_1 \vee \bar{y}_1 \vee \bar{y}_2) \wedge (x_1 \vee \bar{y}_1 \vee y_2) \wedge (x_1 \vee y_1 \vee \bar{y}_2)$

$k=2$ for $C = \exists x_1 \vee x_2 \exists C' = (x_1 \vee x_2 \vee \exists) \wedge (x_1 \vee x_2 \vee \bar{\exists})$

$k > 3$ for $C = \exists x_1 \vee \bar{x}_3 \vee x_4 \dots \exists C' = (x_1 \vee \bar{x}_3 \vee x_4) \wedge (\bar{x}_3 \vee x_4 \vee \bar{x}_2) \wedge (\bar{x}_2 \vee x_4 \vee \bar{x}_1) \dots$

• $\exists SAT$ we can have a poly-time algorithm to solve it.

Reducing decision problem to optimizing problem: use the decision problem as a oracle, according to input size do binary search and run decision problem.

• $A \leq_M^P B \Rightarrow$ if we have a poly-time algorithm decide B, then we can have a ... decide A

$SAT \leq_M^P \exists SAT, \exists SAT \leq_M^P \text{Vertex Cover} \leq_M^P \text{IND} \leq_M^P \text{Clique}$

$\leq_M^P \exists\text{-D Matching} \leq_M^P \exists\text{-XC} \leq_M^P XC$

$\leq_M^P HAM \leq_M^P TSP$

• P is closed under union, concatenation, complement, star, intersection

union: check both decider and if either accept

concat: separate input in n ways and run both decider

complement: reverse accept / reject

star: on input assume $y_1, y_2, \dots, y_n \in \Sigma$

1) if $y = \epsilon$ accept and halt

2) init $T[i,j] = 0$ for $i \in j$

3) for $i=1$ to n

• Run M on y_i . If $y_i \in L$ set $T[i,j]=1$

4) for $k=2$ to n , for $i=1$ to $n-k+1$

a) $j = i+k-1$

b) Run M on $y_i \dots y_j$ and set $T[i,j]=1$

c) for $l=i$ to $j-1$, set $T[i,j]=1$ if $T[i,j]=1$ and $T[i,l]=1$

Accept if $T[1,n]=1$

• NP is closed under union and concatenation, star, intersection

union: verify in both verifier

concatenation: split S in $S=S_1S_2$ O(n) on non-deterministic cheerleader

star: for each $w=w_1 \dots w_k$ non-deterministically guess certificate, verify all.

• if P: NP then every A \in P except $A=\emptyset$ and $A=\Sigma^*$ is NP-Complete.

• A \in P and B \in P A is not necessarily \leq_M^P B as B could be trivial and A non-trivial

Vertex-Cover

input: $G = (V, E)$, k

question: is there a subset $S \subseteq V$, $|S| \leq k$ s.t. $\forall e = \{x, y\} \in E$, either $x \in S$ or $y \in S$

from $3SAT \leq_p VC$

for the instance of 3SAT, $X = \{x_1, x_2, \dots, x_n\}$, $C = \{c_1, c_2, \dots, c_m\}$

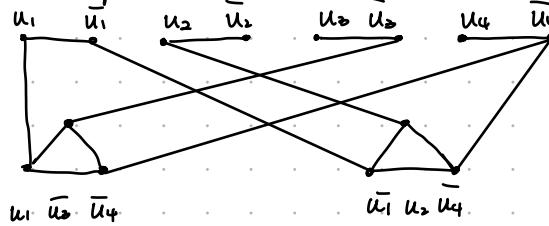
create following graph:

for each variable x_i , have $(x_i) \rightarrow (\bar{x}_i)$, S need to contain at least one of x_i, \bar{x}_i

for each clause c_i , have a triangle representing 3 literals



connect corresponding variable



to have a VC, must have 2 edge in 1 triangle and a out edge (must be 1 true in 1 clause)

$\Rightarrow 2m + n = k$, the resulting graph have $3m + 2n$ vertex, $k = 2m + n$.

Independent Set

input: $G = (V, E)$, k

question: is there a subset $S \subseteq V$, $|S| \geq k$ s.t. $\forall e = \{x, y\} \in E$, x, y don't both in S

from $VC \leq_p IND$

for the same graph, find a VC for $|S| = k$, take $V - S$ of VC $\Rightarrow IND$

Clique

input: a graph $G = (V, E)$, k

question: Is there a clique of at least size k ? clique: $S \subseteq V$ is called a clique if every vertex in S , all edge exist

$IND \leq_p Clique$

every vertex is connected to every other vertex by edge

create a new graph and reverse the edge, find IND.

A Matching $M \subseteq E$ s.t. no 2 edges are incident (share a vertex)

for $|X| = |Y| = n$ $G = (X \cup Y, E \subseteq X \times Y)$ A perfect matching is $|M| = n$

for $\forall s \subseteq X$ (left side) $T(s)$ be their neighbors = { $y \in Y, (s, y) \in E$ for some $s \in S\}$

The problem of 2PM can be solved \Rightarrow If G has a perfect matching

If G has a perfect matching, then $|T(s)| \geq |s| \forall s \subseteq V$, if $s \subseteq V$ $|T(s)| < |s| \rightarrow$ not matching

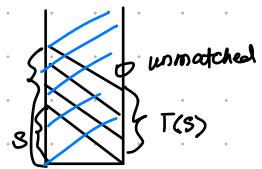
proof: Augmenting path: start/end with non-matching edge \Rightarrow 2 vertex not matched \Rightarrow increase matching size by exchanging.

We can give a P time algorithm to find a PM, prove there is no PM for $|T(s)| < |s|$

① Start with a perfect matching M (initially \emptyset)

② enumerate all unmatched \Rightarrow left sets and neighbors $T(s)$ matched

the algorithm shall halt in n vertices.



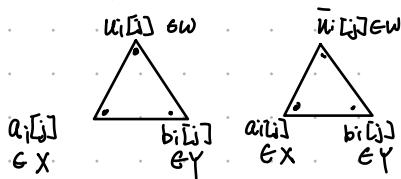
3DM

Input: X, Y, W $|X| = |Y| = |W| = n$ & a set of triples (x, y, w) $x \in X, y \in Y, w \in W$

question: is there a subset T' of T s.t. every $v \in X \cup Y \cup W$ has exactly one of them $|T'| = n$

prove $3SAT \leq_P^w 3DM$

design the gadget



have $m \times 2$ gadget

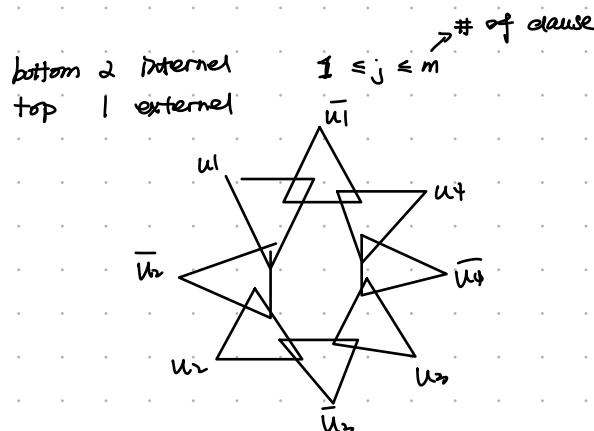
$$N = n m - m$$

3XC: Exact Cover

Input: a finite set X with $|X| = 3q$ and a collection C of 3 element subsets of X

question: does C contains an exact cover for X , a subcollection $C' \subseteq C$ s.t. $\forall x \in X$ occurs exactly one member of C'

regard 3DM as unordered subset of $W \cup X \cup Y$, matchings in 3DM $\rightarrow XC$



HAM: Hamiltonian circuit / path

Input: a graph $G = (V, E)$

A HAM circuit $(v_{ij}, v_{ij+1}) \in E, i = j < n, n+1 \equiv 1 (n)$ is a cycle that visits every vertex exactly once and return to the beginning.

A HAM path is the circuit without going back to beginning.

Eulerian circuit: Instead of traveling vertex, traverse all edge. exact once.

\hookrightarrow iff $\{ \forall v \in V \text{ degree}(v) = \text{even} \Rightarrow \text{has in-out pair}$

is a fully connected graph

\hookrightarrow P-time solvable: just go on as you go, when you stuck at some place \Rightarrow must be odd

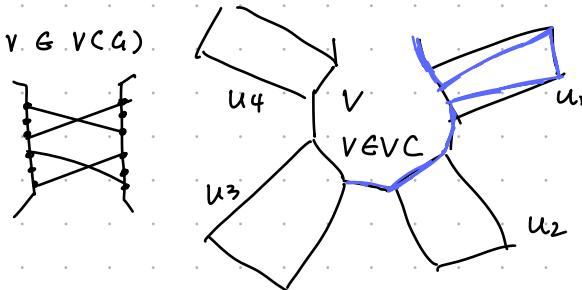
if finished to start without getting all edges: revise your step!

\hookrightarrow the place you haven't visit is also a Eulerian circuit.

prove $VC \leq_p^m HAM-C$

• Start with a VC instance $G = (V, E), k$

• Construct a graph G' every vertex get replaced with



each tour visit some part of the graph
(inside a VC)

if $u_i \notin VC$

$u_i \in VC \Rightarrow$ the edge will be take care by VC

The resulting graph \Rightarrow

have k selected vertex $s_1 s_2 \dots s_k$

$s_1 \dots s_k$ have connection into the chain

$\hookrightarrow k$ round of bus tour.

$s_1 \rightarrow$ selected vertex cover v entry \rightarrow travel around

\rightarrow exit from v and start from $s_2 \rightarrow \dots$

\rightarrow start at $s_k \rightarrow$ exit at $s_k \rightarrow$ go to s_1

TSP:

Input: $G = (V, E)$ & $w: E \rightarrow \mathbb{R}_+, k$

question: start from some vertex, and visit every vertex at least once and return to the starting vertex

s.t. weight $\leq k$ / total weight is minimized

$HAM-C \leq_p^m TSP$

• If HAM-C exist, TSP \Rightarrow has minimum.

For a given TSP graph, set all $e \in E$ as $w=1$, ask if \exists TSP for cost $n \Rightarrow$ give HAM-C

$U-HAMPATH$ is also NP-Complete,

$HAMP \leq_p^m UHAM$

input: Directed graph G , and start point s end point t

\hookrightarrow for each $v \in V$ except s and t , replace by a triple $(v^{in}, v^{mid}, v^{out})$

$s = s^{out}, t = t^{in}$

① connect edges v^{mid} with v^{in} and v^{out}

② connect v^{out} with z^{in} if edge in G is $v \rightarrow z$

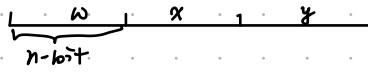
Subset Sum Problem

Input: A set of positive integers $S = \{n_1, n_2, \dots, n_m\}$ & a target T

Question: Is there a subset of S that sums to T (a positive integer)

\hookrightarrow Input length = # bits to specify the problem $\sum_{i=1}^m \lceil \log(n_i) \rceil + \lceil \log(T+1) \rceil$

prove NP-Complete by 3DM \leq_p Subset Sum



- Design number of $3n$ bits. Bits position labeled by elements $w \cup x \cup y$

- each triple 3DM instance (w_i, x_j, y_k)

Let $N(w_i, x_j, y_k) = \text{binary } \#$, have exactly one at the positions correspond to $w_i x_j y_k$

$$= 2^{k-1} + 2^{n+j-1} + 2^{2n+i-1}$$

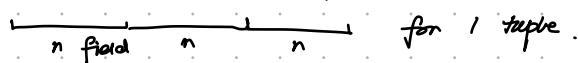
\hookrightarrow solution for 3DM: all element in w, x, y can be triples without overlapping

solution for Subset Sum $T = 2^{3n} - 1$

\hookrightarrow but, it won't handle carry in/out \Rightarrow we now add buffers

Now, consider binary $\#$ 3. That are $3 \cdot n \cdot \#$ of tuples.

n fields: each field have $\#$ of tuples many bit positions and one 1 in least significant bit in fields



Target: one 1 in each field (at least significant bit of level)

on the other side: if there is other than \downarrow 1, it cannot go out of buffer

Attempt on poly-time algorithm: $n!$ is not n , N can be exp.

- if Subset Sum is in unary, then size of input = length

\hookrightarrow if binary, $\log n$ needed to represent input value x

\hookrightarrow compare to N in binary, unary is 2^n

\hookrightarrow more than exponent time to reduce Subset Sum to 3DM

\hookrightarrow Unary Subset $\in P$

① Compute sum of input

② Check if the sum of $\# \geq S$, if no, reject

③ run DP on input