

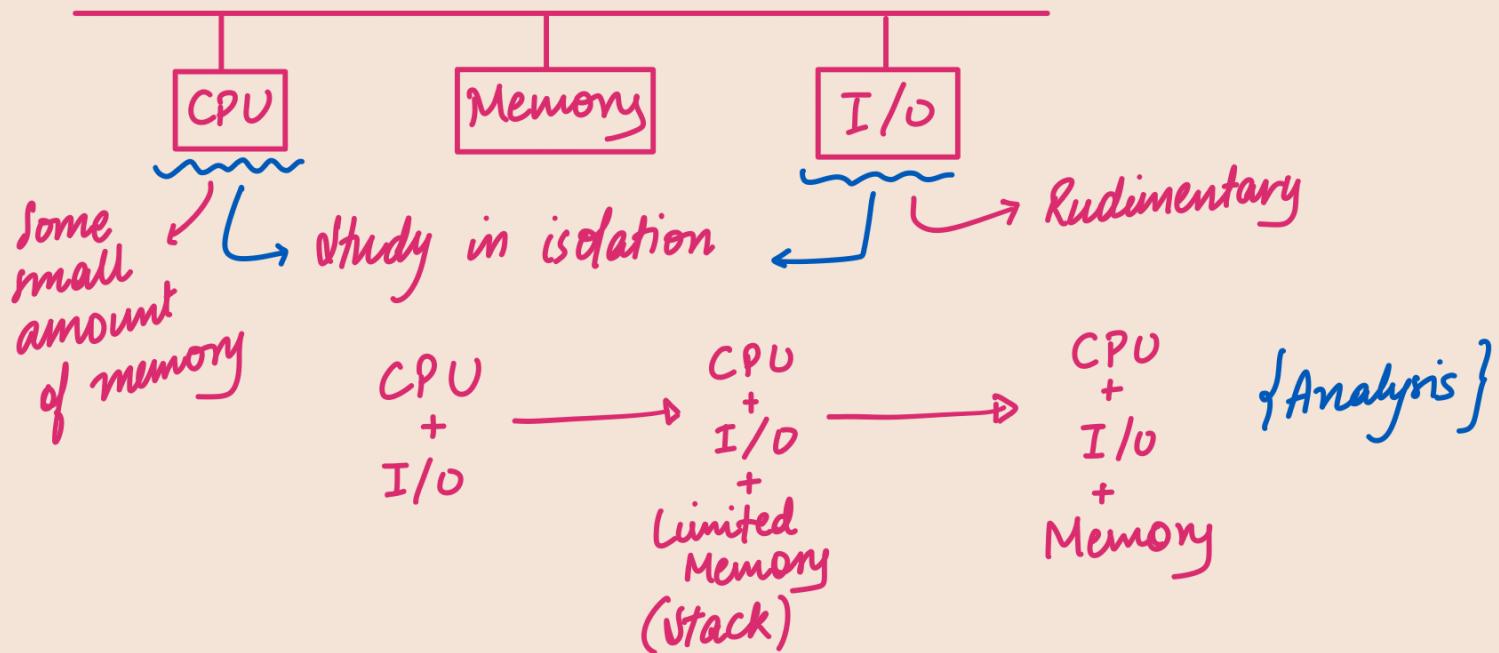
Course Logistics

Assgn (4): 25%, MidSem: 25%, EndSem: 50%

Grading: 80% + \Rightarrow A, 20% + \Rightarrow D+

Textbooks: By Michael Sipser (Intro. to the T.O.C.)
By Dexter Kozen (Automata & Computability)

What is a computer?



Formalism

- A **computer** computes **functions**.
 $f: D \rightarrow R$
 (Domain) (Range) Interested in knowing
the class of functions
- Domain/ Range**: A sequence of bits
- Sequence of bits**
 - Alphabet**: A set of symbols.
 Typically denoted as Σ

Ex. $\Sigma = \{0, 1\}$, $\Sigma = \{a, b, c, \dots, z\}$, etc.
 $\Sigma = \{0, 1, \dots, 8, 9\}$, etc.

• **Strings:** A finite sequence of symbols from an alphabet.

Denoted as Σ^*

$$\Sigma^* = \{a_1 a_2 \dots a_m \mid a_i \in \Sigma\}$$

Ex. $\{0, 1\}^*$: Set of all binary strings

$\{0, 1, \dots, 9\}^*$: Set of all non-negative numbers

$\{a, b, \dots, y, z\}^*$: Set of all words using the English Alphabet.

• $D : \{0, 1\}^*$, $R : \{0, 1\}^*$

• Let F be the class of functions computed by a computer.

For any function $f : \Sigma^* \rightarrow \Sigma^*$, define

$$A_f = \{(x, y) \mid f(x) = y\}$$

• A **set** is a special function: $f : \Sigma^* \rightarrow \{0, 1\}$

$$\hookrightarrow \{x \mid f(x) = 1\}$$

• A string y is a **prefix** of string z if $z = yz'$ for some string z' .

Ex. Define $A_f = \{(x, y) \mid f(x) = yz, \text{ for some string } z\}$

→ y is a prefix of $f(x)$

→ Computing f from A_f

• Given x . check if $(x, 0) \in A_f$ OR $(x, 1) \in A_f$

• If $(x, 0) \in A_f$, check for $(x, 00) \in A_f$ OR $(x, 01) \in A_f$, etc.

★ Order of Sets with (x, y) is the same as Order of Real Numbers.
 But. Order of Computable sets (= Programs) is the same as the order of Natural Numbers.

Consider CPU at a specific stage of computation. Contents of its registers define the state of CPU at that stage.

CPU has finitely many states independent of input. (Input is also finite)

Q : The set of states of CPU

q_0/s_0 : Starting state of CPU.

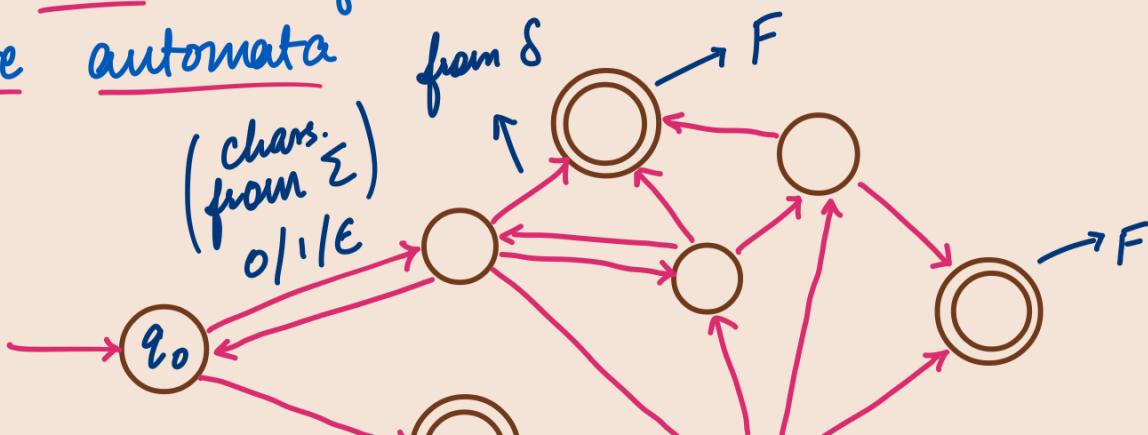
δ : $\delta : Q \times \Sigma \cup \{\epsilon\} \xrightarrow{\text{Null or empty string}} Q$, Transitions

F : $F \subseteq Q$, Final States

Σ : Alphabet

Def. A **finite automata** is described by
 5-tuple $(Q, q_0, \Sigma, \delta, F)$.

Representation of
 finite automata

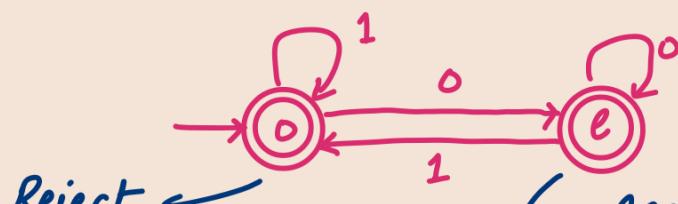




Ex. Set of even numbers written in binary

$$A = \{ s0 \mid s \in \{0,1\}^* \}$$

We have to label the states : 'reject' and 'accept'



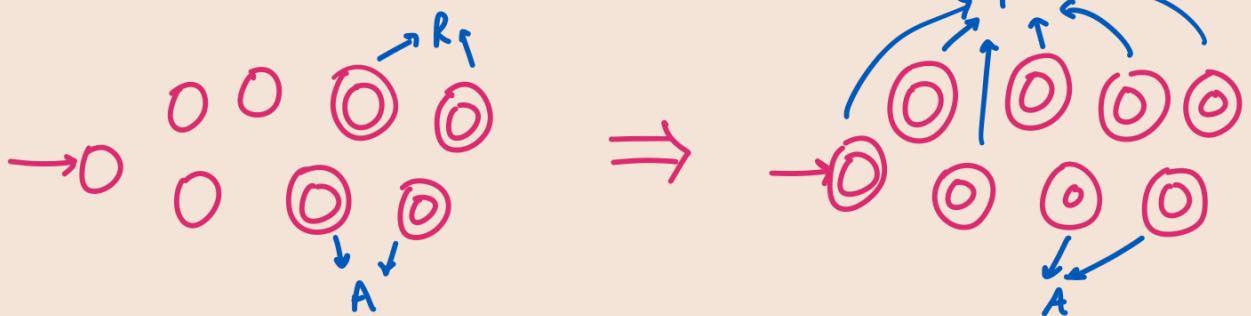
Reject ← Accept

What if we didn't need to?

Only 'accept's included in final state and then if automata lands on them, it is accepted.

Lemma: A set accepted by a finite automata is also accepted by a finite automata in which every state is either accepting or rejecting.

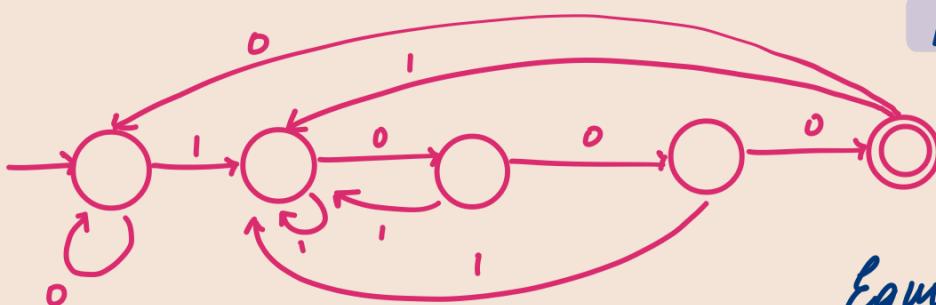
Pf:



From now on, F : Only accepting states

Ex. $A = \{ s1000 \mid s \in \{0,1\}^* \}$

Deterministic
Finite Automata
(DFA)



Equivalent in terms
of inputs accepted



Non-deterministic

Finite Automata (NFA)

- ★ A **deterministic finite automata** is a 5-tuple $(Q, q_0, \Sigma, \delta, F)$ where
 - 1) $F \subseteq Q$ is a set of accepting states
 - 2) $\delta: Q \times \Sigma \rightarrow Q$
DFA accepts an input x if starting from q_0 , it ends up in a state of F .
- A **nondeterministic finite automata** is a 5-tuple $(Q, q_0, \Sigma, \delta, F)$ such that
 - 1) $F \subseteq Q$ is accepting states
 - 2) $\delta: Q \times \Sigma \cup \{\epsilon\} \rightarrow 2^Q$
NFA accepts an input x if starting from q_0 , it is possible to end up in a state of F .

Ex.

Suppose F_1, F_2 accept sets A_1, B A_2 .
Design an automata to accept $A_1 \cup A_2$.

Let $F_1 = (Q_1, q_0^1, \Sigma, \delta_1, F_1)$ &

$F_2 = (Q_2, q_0^2, \Sigma, \delta_2, F_2)$

$F = (Q, q_0, \Sigma, \delta, F)$

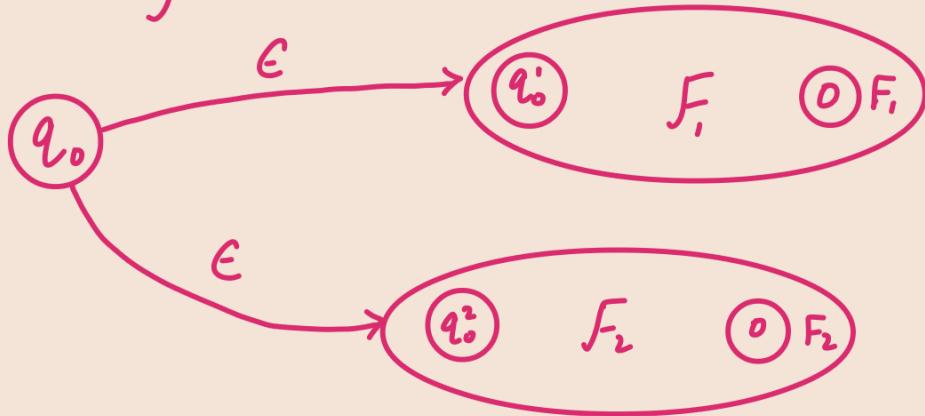
$F = (Q_1 \times Q_2, \langle q_0^1, q_0^2 \rangle, \Sigma, \langle \delta_1, \delta_2 \rangle, F_1 \times F_2 \cup Q_1 \times F_2)$

$\langle \delta_1, \delta_2 \rangle := \langle q_1, q_2 \rangle \xrightarrow{a} \langle \delta_1(q_1, a), \delta_2(q_2, a) \rangle$

$F_{\text{acc}} = A_1 \cap A_2$

$F = F_1 \times F_2$

→ Let's try the same with an NFA



For $A_1 \cap A_2$, NFA is not much better than a DFA

Theorem : A set accepted by an NFA is also accepted by a DFA

Pf: Let $F = (Q, q_0, \Sigma, \delta, F)$ be an NFA.

Define $F_D = (2^Q, \{q_0\}, \Sigma, \delta_D, F_D)$

$$F_D = \{H \mid H \subseteq Q \text{ & } H \cap F \neq \emptyset\}$$

At least one state from F should be in H / be reachable

$$\delta_D(H, a) := \{\delta(q, a) \mid q = \delta(p, \epsilon_0) \text{ for } p \in H \text{ & } \epsilon_0 \in \{\epsilon\}\}$$

$$\text{OR} := \{\delta(q, a) \mid q \text{ is reachable through } \epsilon \text{ transitions}\}$$

Def. Let F be a finite automata. The set of strings accepted by F is called a **regular set**.

Properties of Regular Set

1) Closed under union and intersection

Construction of durable FSM was seen earlier

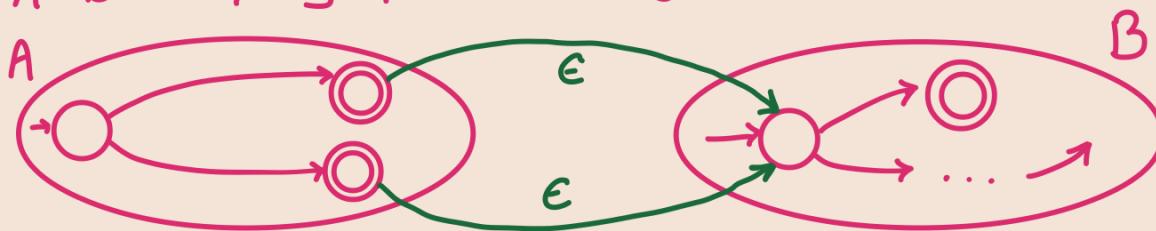
2) Closed under complement:

If $A \subseteq \Sigma^*$ is a regular set, then $\Sigma^* - A$ is also a regular set



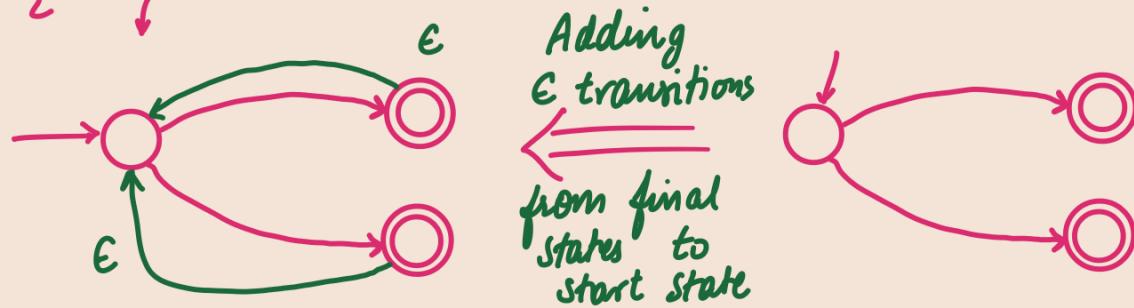
3) Closed under operation (Concatenation)

$$A \cdot B = \{ xy \mid x \in A, y \in B \}$$



4) Closed under * operation

$$\Sigma^* \leftarrow A^* = \{ y \mid y = x_1 x_2 \dots x_k, x_i \in A \}$$



Regular Expressions (Reg Ex)

Regular Expression over alphabet Σ is defined as:

(i) $a \in \Sigma$ is a regex

(ii) ϵ is a regex

- (iii) If r_1, r_2 are r.e., No is $r_1 + r_2$

(iv) If $r_1 \cdot r_2$

(v) If r is .. , r^*

A regex r defines a set $L(r)$ in Σ^* as follows

- (i) $r = a \in \Sigma \implies L(r) = \{a\}$
 - (ii) $r = \epsilon \implies L(r) = \{\epsilon\}$
 - (iii) $r = r_1 + r_2 \implies L(r) = L(r_1) \cup L(r_2)$
 - (iv) $r = r_1 \cdot r_2 \implies L(r) = L(r_1) \cdot L(r_2)$
 - (v) $r = r_1^*$ $\implies L(r) = L(r_1)^*$

Ex. (i) $(0+1)^*$: $\{0,1\}^*$ {All binary strings}
(ii) $1(0+1)^* 0$: All strings starting with
1 and ending with 0

- Regular Expressions
Made by $\Sigma, +, \cdot, *$
 - Regular Sets
Accepted by FA

Theorem: Set A is regular iff $A = L(r)$ for some regular expression r

Pf: Suppose A is accepted by DFA F . A generalized NFA (GNFA) is a finite automata where transitions are done on regular expressions.

Formally,

$$GNFA = (Q, \Sigma, q_0, \delta, F)$$

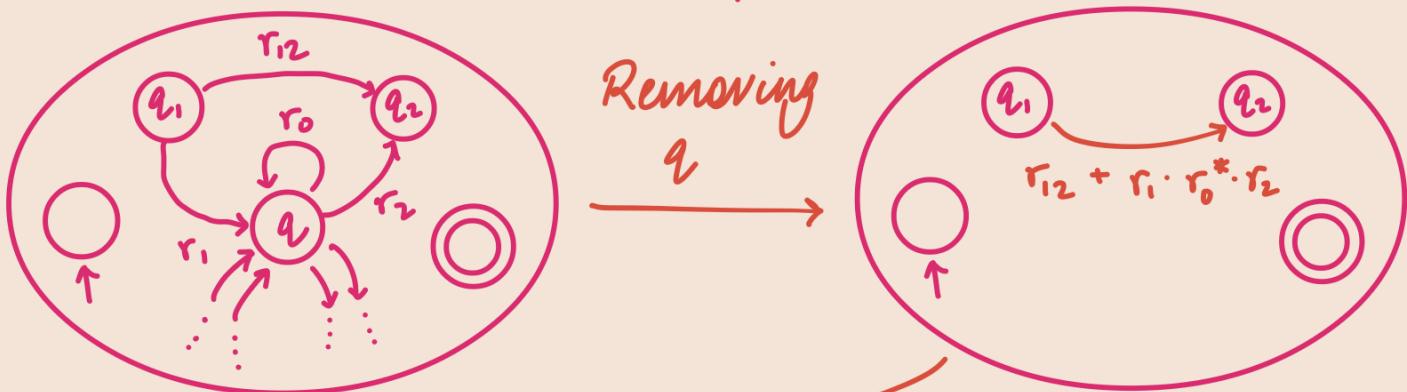
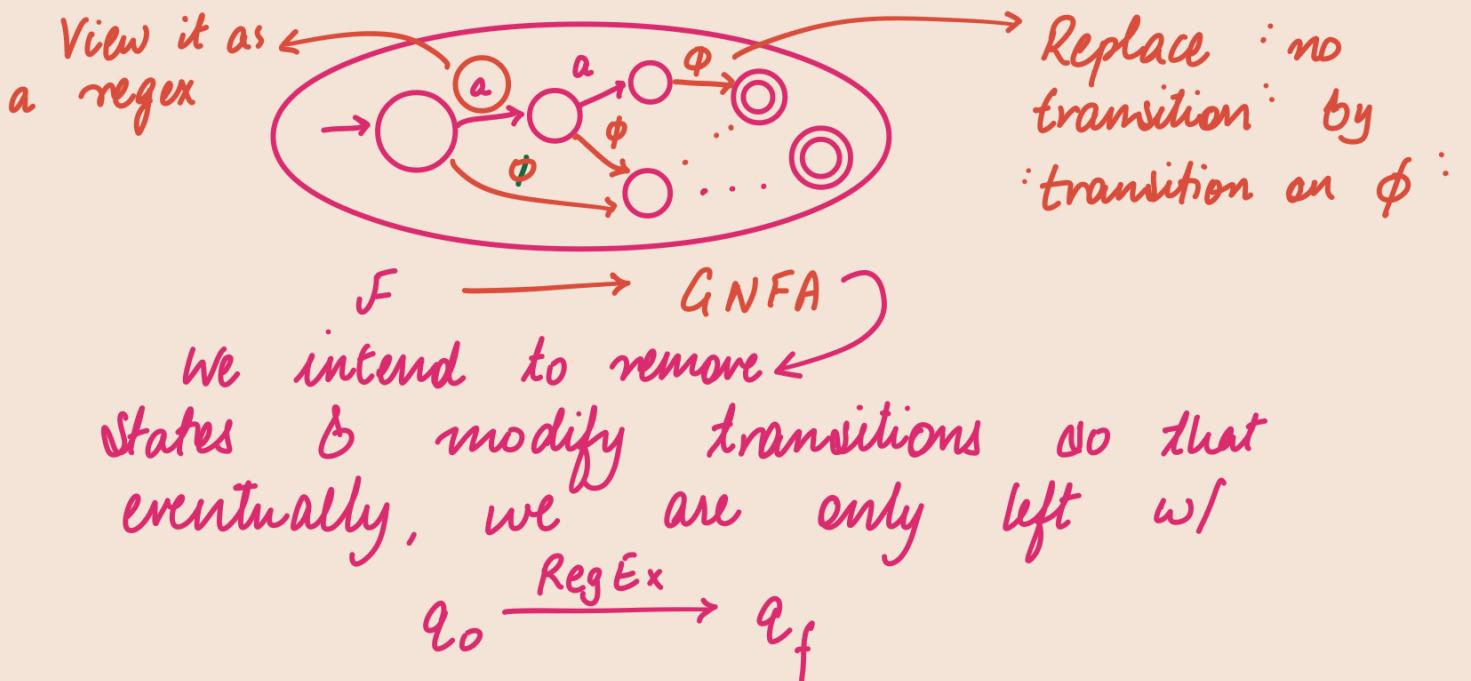
with

$$\delta : Q \times R \rightarrow Q$$

where

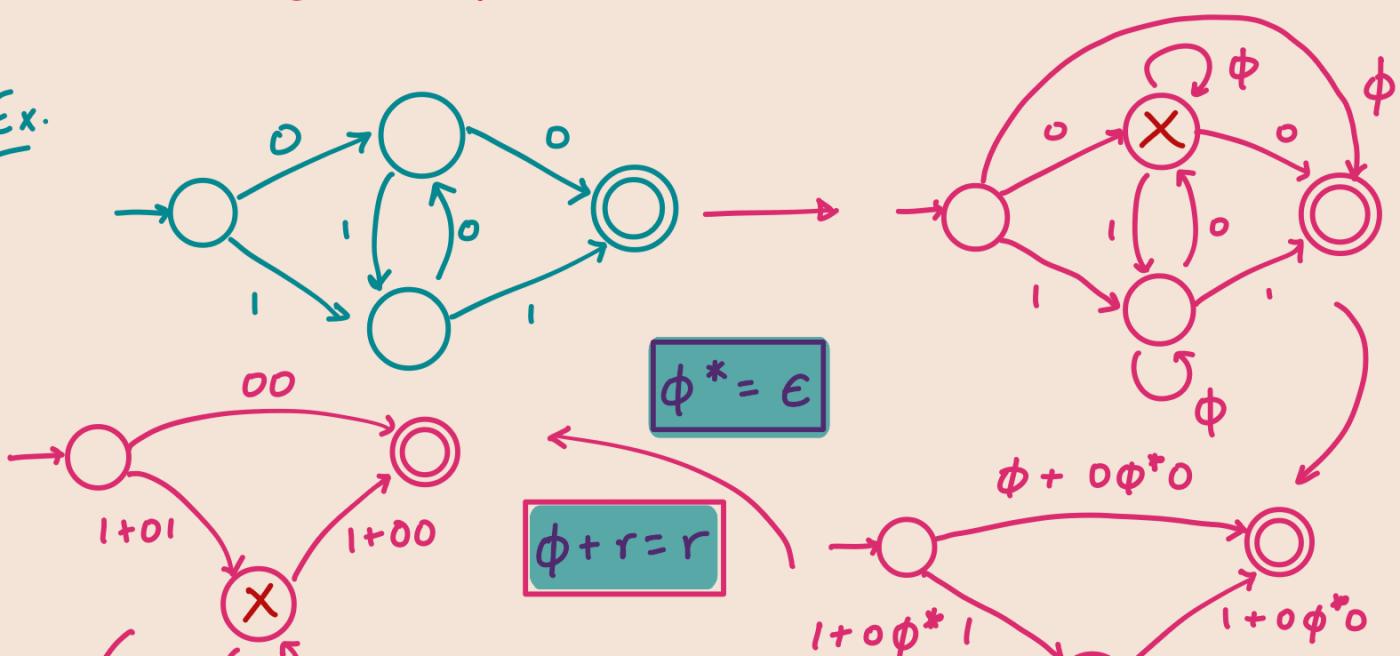
$R = \text{Set of all regex over } \Sigma$
and also includes \emptyset

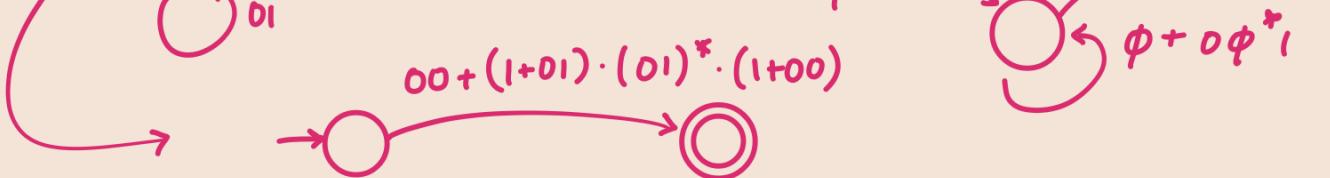
Observation: We can easily convert \mathcal{F} to a GNFA



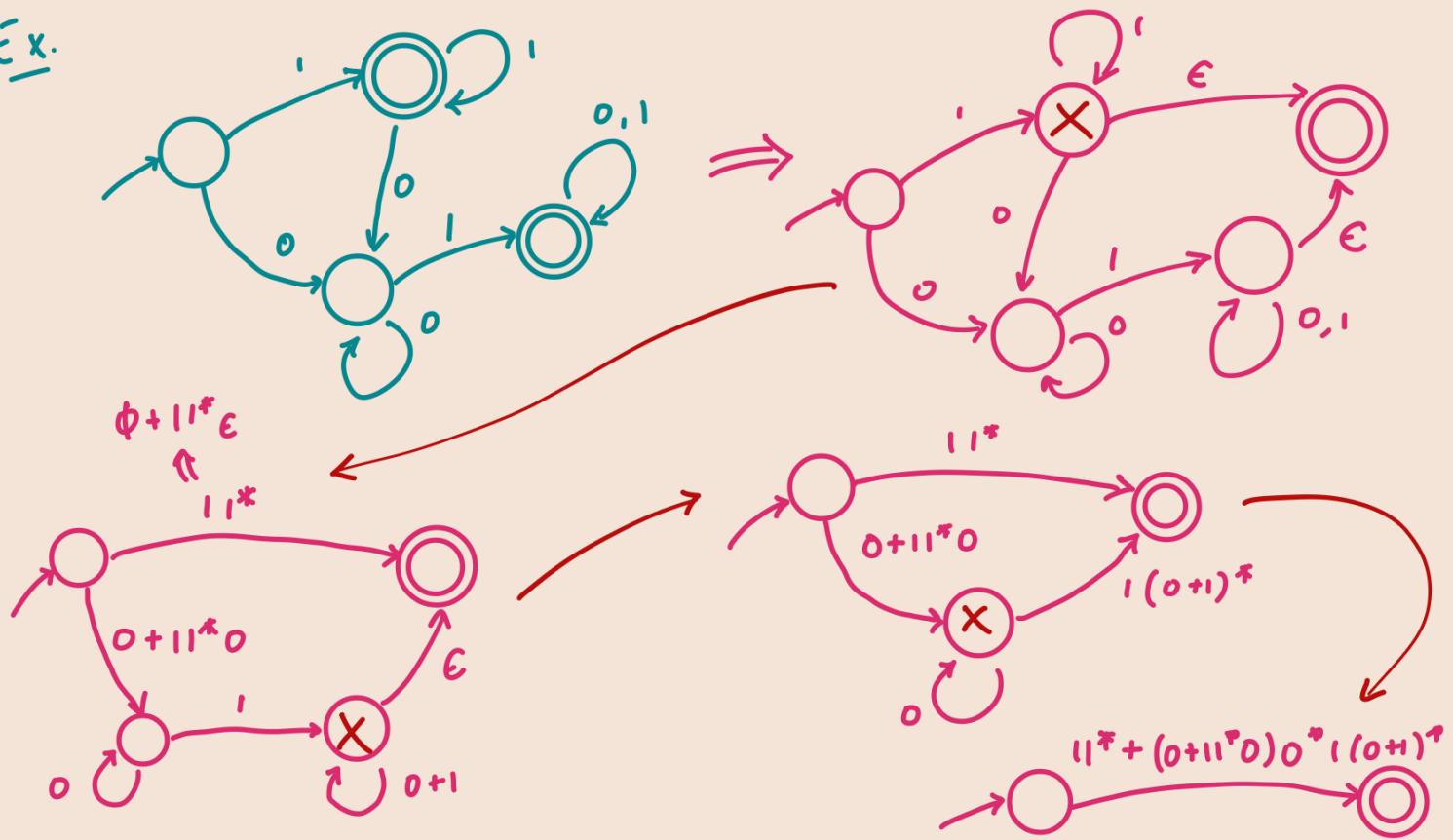
Repeat this & keep removing intermediate states and terminate at Thus, A being a regular set
 $\Rightarrow \exists r \mid L(r) = A$

Ex.





E.x.



Myhill - Nerode Theorem

For any regular set A , there is a unique deterministic automata with minimum number of states accepting it

Pf: Let A be a regular set.
Define a relation R on it as follows:

$x R y$ iff for every z ,
 $xz \in A$ iff $yz \in A$

R is an equivalence relation:

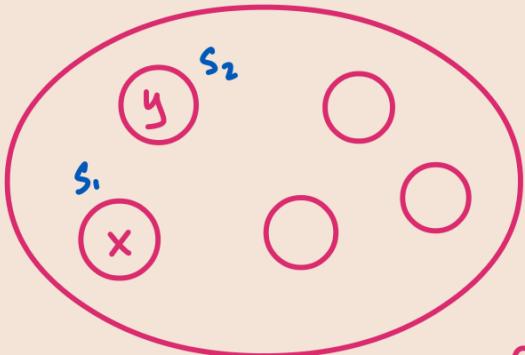
- (Reflexive) $x R x$

- (Symmetric) $x R y \Rightarrow y R x$

- (Transitive) $x R y \text{ & } y R v \Rightarrow x R v$

Consider any $w \in xw, zw$, then,
 $xw \in A \Rightarrow yw \in A ; yw \in A \Rightarrow zw \in A$
 $\therefore xw \in A \Rightarrow zw \in A$; Similarly $zw \in A \Rightarrow xw \in A$

Consider equivalence classes formed by R on Σ^*



Can some input bring x & y to the same state? $[x R y]$

No.

Suppose $\exists w$ s.t. either
 $xw \in A$ b. $yw \notin A$ \longrightarrow xw will be taken
or $xw \notin A$ b. $yw \in A$ to a final (= accept) state but yw won't or vice-versa

\Rightarrow Different eq. classes will take a DFA accepting A to different states

\therefore Label the equivalence classes with:

S_i : Set of states that DFA ends up in on reaching the i^{th} equivalence class

Also,

$$S_i \cap S_j = \emptyset \quad (\text{for } i \neq j)$$

$$\bigcup S_i = Q \quad (\text{the set of states in the DFA})$$

A new DFA based on equivalence classes:
Let $E =$ set of all equivalence classes,
each represented as $[x]$ where x belongs to the class

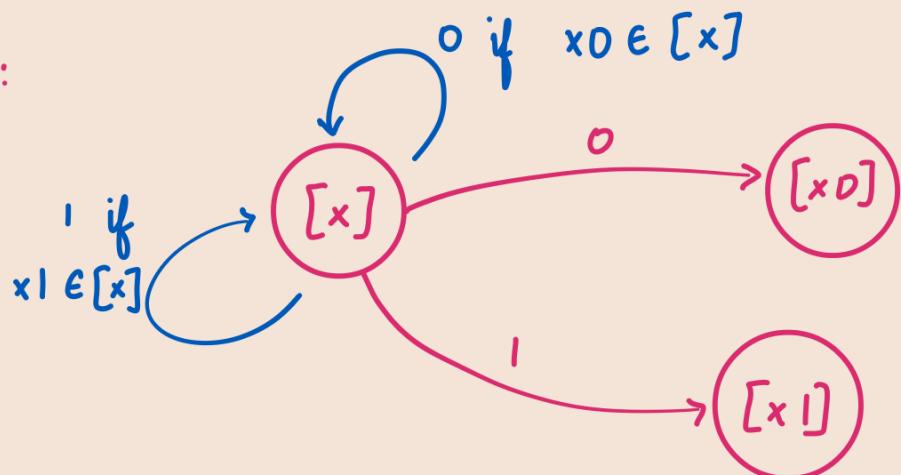
Define

$$F = (E, [e], \delta, F, \Sigma)$$

F : Set of final states \equiv Set of equivalence classes which contain strings accepted by DFA

$$F = \{ [x] \mid [x] \cap A \neq \emptyset \}$$

δ :



$$\delta([x], a) = [xa]$$

Lemma: F on input x ends up in state $[x]$

Pf: By induction on $|x| = \text{length of } x$

$$\text{BS: } |x|=0 \Leftrightarrow x=\epsilon,$$

automata is in state $[\epsilon]$

IS: Assume for $|x| < n$,

consider x , $|x|=n$. Let $x=ya$,
 $|y|=n-1$; On reading y , F ends up
 in $[y]$ $\Rightarrow \delta([y], a) = [ya] = [x]$

on reading $x \in A$, F ends up in $[x]$
 b $[x] \in F$.

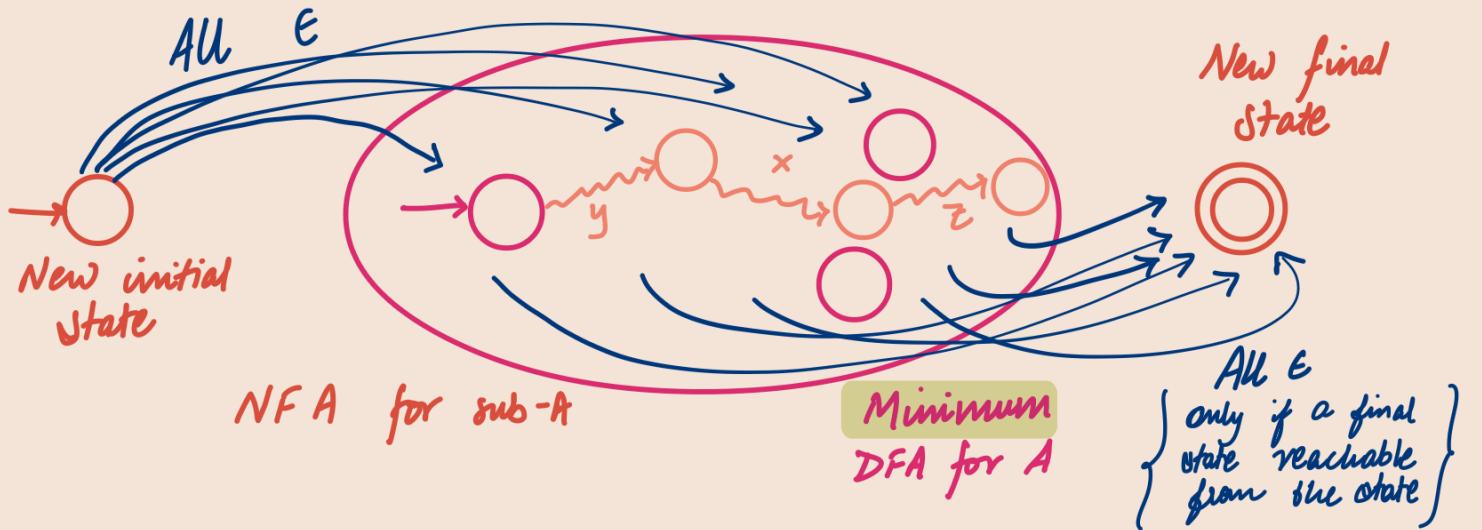
On reading $x \notin A$, F ends up in $[x]$
 b $[x] \notin F$.

Wkt any deterministic automata accepting A ,
 will have number of states $\geq |E|$

$\therefore F$ is a DFA with minimum
 number of states accepting A .

Def : Substring Let A be a regular set
 Define $\text{sub-}A := \{x \mid \exists y, z \in \Sigma^* \text{ s.t. } yxz \in A\}$
 Set of All substrings of A

Lemma: A is regular $\Rightarrow \text{sub-}A$ is regular



$\rightarrow yxz$ accepted by $\text{DFA}_A \Rightarrow x$ accepted by $\text{NFA}_{\text{sub-}A}$

start $\xrightarrow{y} s_1 \xrightarrow{x} s_2 \xrightarrow{z} \text{Accept}$ v/s start $\xrightarrow{E} s_1 \xrightarrow{x} s_2 \xrightarrow{E} \text{Accept}$

$\rightarrow x$ accepted by $\text{NFA}_{\text{sub-}A} \Rightarrow \exists yz, yxz$ accepted by DFA_A

$s_0 \xrightarrow{E} s_1 \xrightarrow{x} s_2 \xrightarrow{E} \text{Accept}$ v/s $\left. \begin{array}{l} \exists y \text{ for } s_0 \rightarrow s_1 \\ \exists z \text{ for } s_2 \rightarrow \text{accept} \end{array} \right\} \Rightarrow yxz \text{ accepted}$
 What if we $\nexists y \nexists z$?

If $\nexists y$ then s_1 is superfluous & it can be deleted w/o effect (s_1 can exist in general DFA). But, we use minimum DFA $\Rightarrow \exists y$ to reach s_1 .

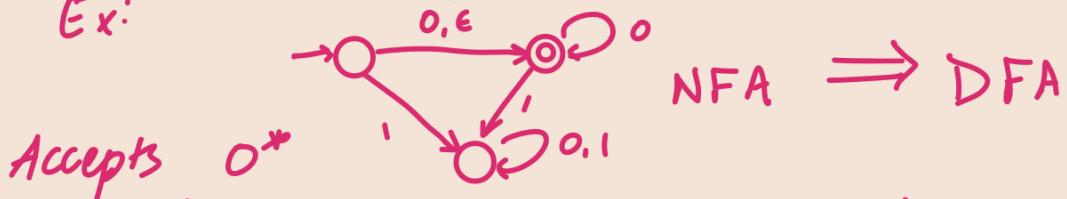
If $\nexists z$, then no extension of x is accepted but NFA makes \xrightarrow{E} to acceptance NFA $\Rightarrow \exists z$ to take s_2 to acceptance in DFA
 Hence, proved

○ Transition from NFA to DFA
 $n = |\Delta|, \delta \rightarrow 2^n \cdot 2^Q$

Exponential blowup

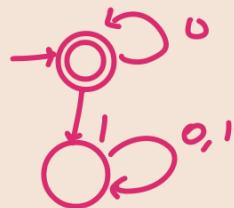
Does not always happen

Ex:



Accepts 0^*

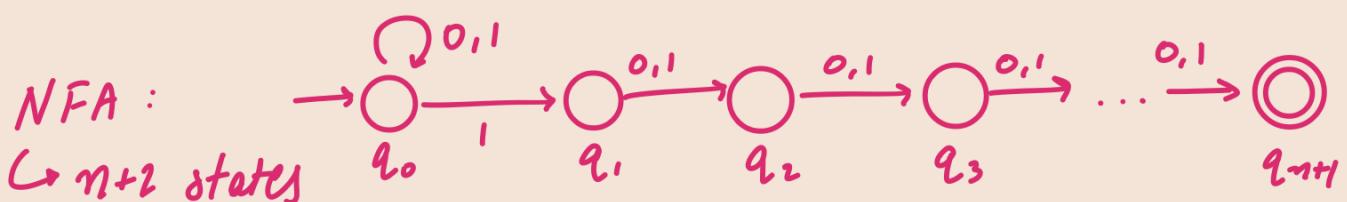
NFA \Rightarrow DFA



Do, is the exponential blowup essential? Yes

Lemma: There is a regular set with an accepting NFA having n states & any DFA that accepts the set has at least 2^{n-1} states

Pf: Let $A = \{x_1 y \mid |y| = n\}$, $\Sigma = \{0, 1\}$
 \hookrightarrow Last $(n+1)^n$ bit is 1



Consider A & eq. classes induced by A
 $x R y \text{ iff } xz \in A \text{ iff } yz \in A$
 \hookrightarrow We intend to find a lower bound on # of eq. classes \Rightarrow lower bound on minimum states
Let $w \in \{0, 1\}^*$, $|w| = n+1$
 $\hookrightarrow E_w = \{xw \mid x \in \{0, 1\}^*\}$

▷ Each E_w is contained in an eq. class induced by A { membership defined only by $n+1$ last bits }

Let $xw, yw \in E_w$

For any z , $xwz \in A$ iff $wz \in A$
 $\geq n+1$ bits iff $ywz \in A$

▷ Diff E_w 's are contained in diff eq. classes

"Consider $E_w \subseteq E_{w'}$ for " $w \neq w'$

Let $w \in E_w \& w' \in E_{w'}$

Suppose w, w' differ on $k^m (\leq n+1)$
bit from right

Consider $w0^{n+1-k} \& w'0^{n+1-k}$

WLOG, assume $\underline{w_k} = 1 \& \underline{w'_k} = 0$

k^m bit from right in w

$\Rightarrow w0^{n+1-k} \in A \& w'0^{n+1-k} \in A$

$\Rightarrow w \& w'$ belong in diff. eq. classes

\therefore Each E_w is unique eq. class $\&$

$\Rightarrow 2^{n+1} = \# E_w \leq \# \text{eq. class}$

$\Rightarrow \text{Size of DFA} \geq 2^{n+1} = 2^{(n+2)-1}$

\Rightarrow Exponential blow-up.

★ What are non-regular sets?

How to know if a set is not regular?

Ex: $A = \{0^n 1^n \mid n > 0\}$ is not a regular set

Pf: Eq. classes induced by A on $\{0, 1\}^*$

For x, y in an eq. class,

$xz \in A \text{ iff } yz \in A$

Consider $\{0^m \mid m > 0\}$

$0^{m_1} 1^{m_1} \in A$ but $0^{m_2} 1^{m_2} \notin A$

\Rightarrow Each element of $\{0^m \mid m > 0\}$
belongs to a diff. eq. class

$\Rightarrow \infty$ elements $\Rightarrow \infty$ eq. class

Pumping

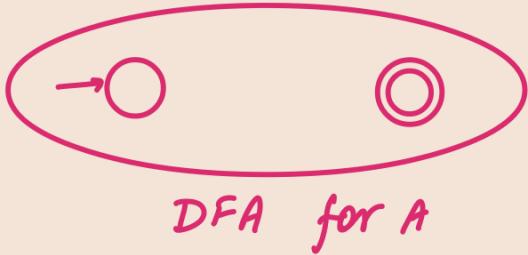
Lemma: Suppose A is regular. Then

$\exists n > 0$ s.t. $x \in \Sigma^*, |x| > n, \exists u, v, w$

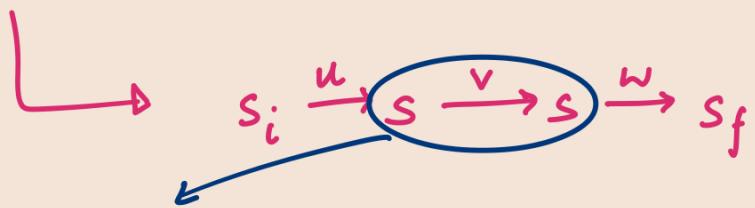
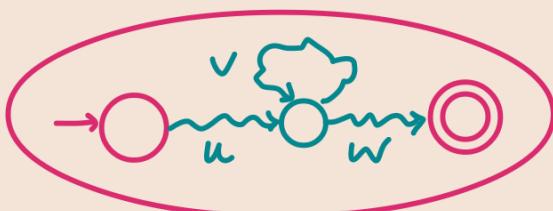
s.t. $x = uvw, |uv| \leq n \& |v| \geq 1$, if $uvw \in A$

Then $uv^i w \in A \quad \forall i \geq 0$

Pf:



If A is infinite, consider $x \in A$ & $|x| > n$, n is the no. of states in the DFA. Now, $|x| > n \Rightarrow$ Some state (s) Pick the first of these \leftarrow reached twice



Can pick this loop any number of times & end up at $s_f \in F \Rightarrow uv^i w \in A \ \forall i \geq 0$

A regular $\Rightarrow \left\{ \begin{array}{l} (\exists n > 0) (\nexists x, |x| > n) \\ (\exists u, v, w \ x = uvw, |uv| \leq n, |v| \geq 1) \\ uvw \in A \Rightarrow \forall i \geq 0 \ uv^i w \in A \end{array} \right\}$

Contrapositive \downarrow

$\left\{ \begin{array}{l} (\forall n > 0) (\exists x, |x| > n) \\ (\forall u, v, w, x = uvw, |uv| \leq n, |v| \geq 1) \\ (uvw \in A \ \& \ \exists i \geq 0 \ uv^i w \notin A) \end{array} \right\} \Rightarrow A \text{ is not regular}$

Ex: $A = \{0^m 1^m \mid m \geq 1\}$. Is A regular?

(+) Adversary picks n , (++) we pick x ,
 $x = 0^n 1^n \in A$. (+) Adversary splits $x = uvw$
 $|uv| \leq n, |v| \geq 1 \rightsquigarrow x = 0^{j+k+l} 1^n$

$$u = 0^j, v = 0^k, w = 0^l 1^n$$

(3) We get to pick i ($i=0$)

then $uw = 0^{j+l} 1^n \notin A \quad \because j+l < n$

By above lemma, A is not regular.

Ex: $A = \{3^m \mid m \geq 0\}$ over $\{0, 1\}$

(+) Adversary chooses $n > 0$

(3) We choose $x = 3^n \in A \quad (|x| = n \log_2 3 > n)$

(+) Adversary chooses

No. represented by u in binary $\leftarrow x = uvw, |uv| \leq n, |v| \geq 1 \rightarrow N_u \leftarrow L \rightarrow N_v \rightarrow N_w$

$$|v| = l, |w| = k$$

$$x = N_u 2^{l+k} + N_v 2^k + N_w$$

Pumping v i times gives number

$$uv^i w = N_u 2^{k+il} + N_v 2^{k+(i-1)l} + N_v 2^{k+(i-2)l} + \dots + N_v \cdot 2^k + N_w$$

Assume $uv^i w \in A \Rightarrow uv^i w = 3^{n_i}$

Consider

$$uv^{i+1} w - uv^i w$$

$$= N_u 2^{k+(i+1)l} + N_v \cdot 2^{k+il} - N_u \cdot 2^{k+il}$$

$$= 2^{k+il} (N_u \cdot 2^l + N_v - N_u)$$

$$= 3^{n_{i+1}} - 3^{n_i}$$

$$\Rightarrow 3^{n_i} (3^{n_{i+1}-n_i} - 1) = 2^{k+il} (N_u \cdot 2^l - N_u + N_v)$$

$$i \uparrow n_i \uparrow 3^{n_i} \uparrow$$

\hookrightarrow more powers of 3

$$\text{if } N_u \cdot 2^l - N_u + N_v \leftrightarrow$$

$\hookrightarrow O(1)$ powers of 3

\Rightarrow For large enough i , 3^{n_i} does not divide $N_u \cdot 2^l - N_u + N_v$

$\Rightarrow A$ is not regular

Previously, we only used CPU and I/O

We now introduce memory in a restricted way in the form of a Stack (also called Pushdown Automata)

A pushdown automata is a 7-tuple $(Q, \Sigma, \Gamma, s_0, \perp, \delta, F)$ where

Q : Finite set of states

Σ : Input alphabet

Γ : Stack alphabet

s_0 : Starting state

\perp : Bottom of stack (denotes)

δ : $Q \times \Sigma \cup \{\epsilon\} \times \Gamma \rightarrow Q \times \Gamma^k$

F : $F \subseteq Q$, set of final states

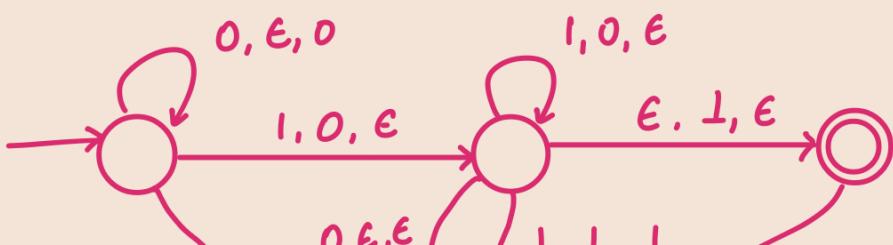
Acceptance can be of two types:

- Final state after the input is read
- Empty stack after the input is read

δ : (State, (Input, Read, Write)) \rightarrow State

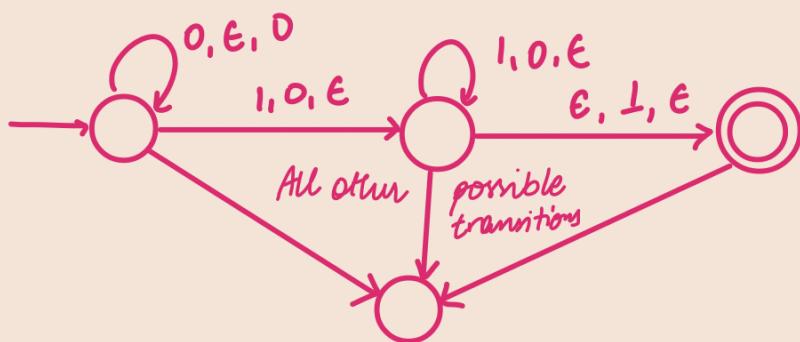
\perp is a special character in the stack denoting its bottom

Ex: $A = \{0^n 1^n \mid n \geq 1\}$



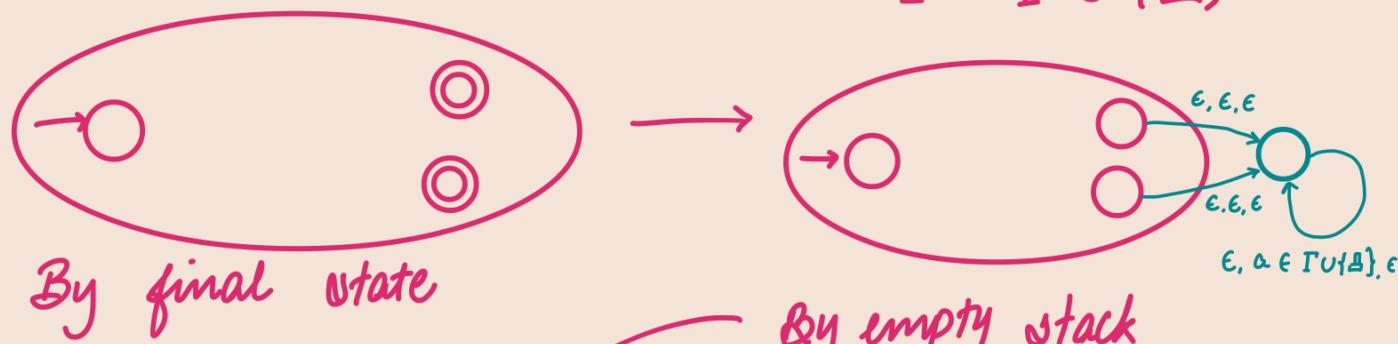


OR

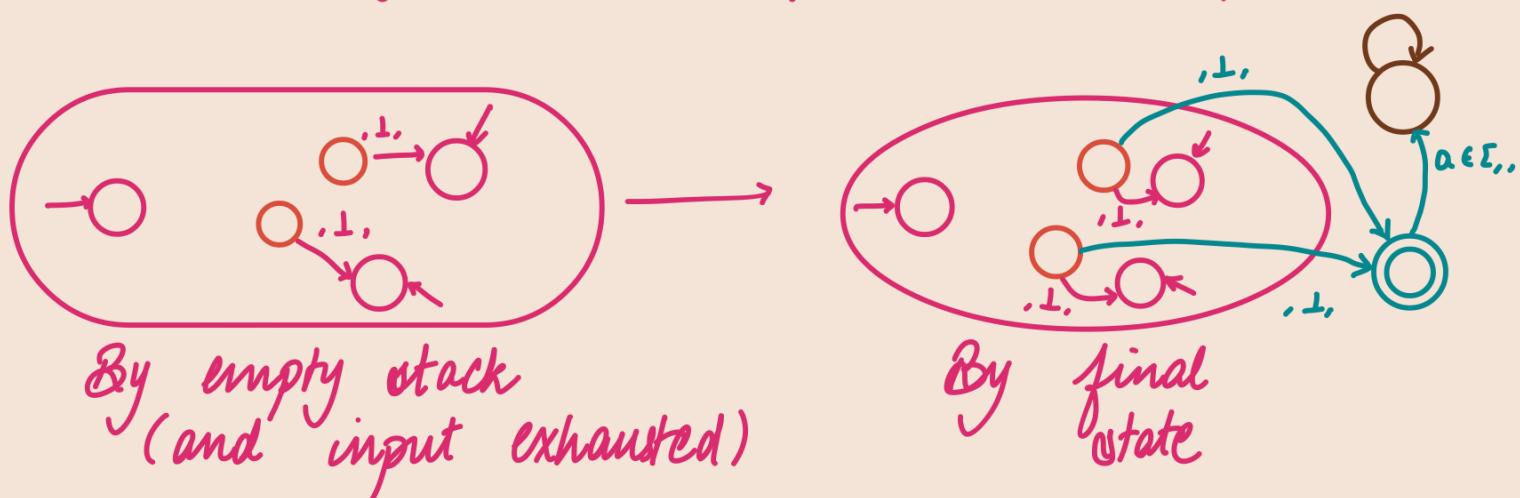


Equivalence of acceptance
by final state & empty stack

$$\Gamma' = \Gamma \cup \{\boxed{A}\}$$



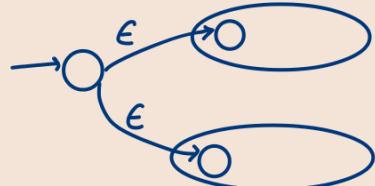
Due to \boxed{A} in Γ' , the stack never gets empty on the right & stack might've gotten empty on the left at a non-final state)



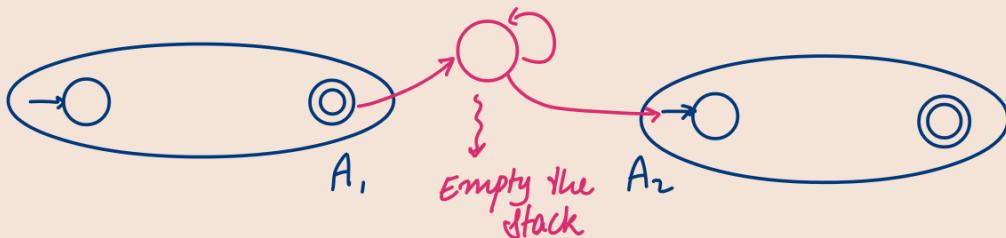
Properties of sets accepted
by PDAs

Push Down Automata

- * closure under union



- * closure under concatenation & *

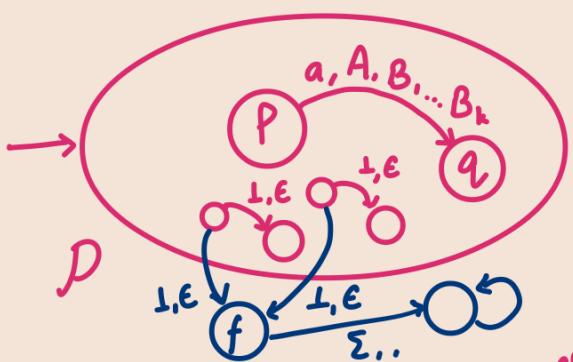


- Not closed under complement & intersection

Theorem: Any PDA can be simulated by a PDA with one state

Proof: Given $(Q, \Sigma, \Gamma, s_0, \perp, \delta, F)$

Assume that PDA accepts by an empty stack $\Rightarrow F = \emptyset$



Define $I' = Q \times I \times Q$
 (q_1, A, q_2) means P moves from q_1 on input A to state q_2 (after a series of transitions) and

stack no longer has A at the top
 (rest of the stack remains the same)

{ It might be the case that A is at the top of the stack multiple times }

Define a new PDA as:

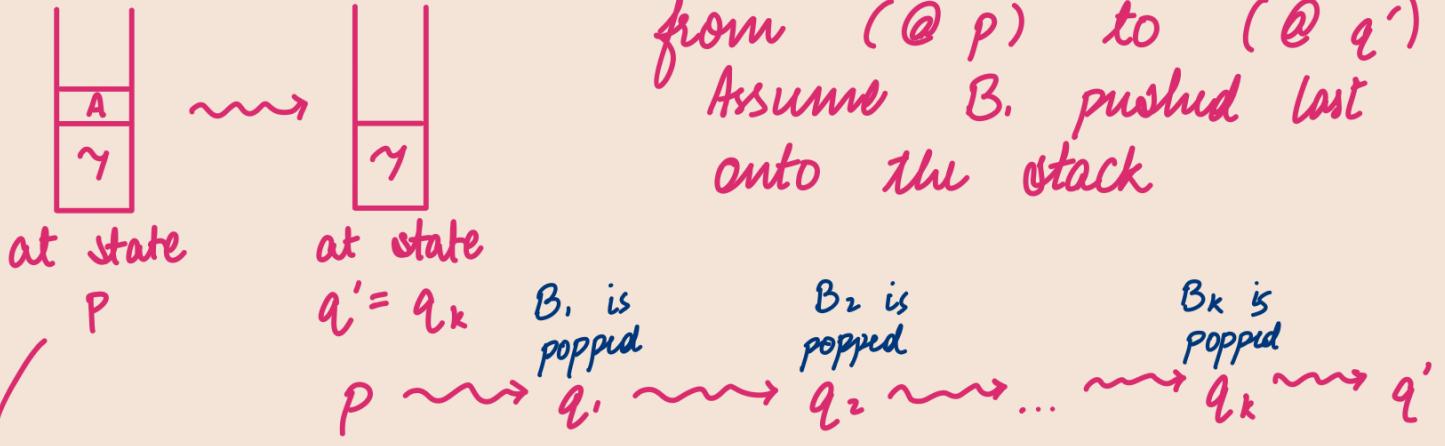
$(\{r\}, \Sigma, I', r, \perp', \delta', \emptyset)$ → Accepts only on empty stack

$\perp' := (s_0, \perp, f)$

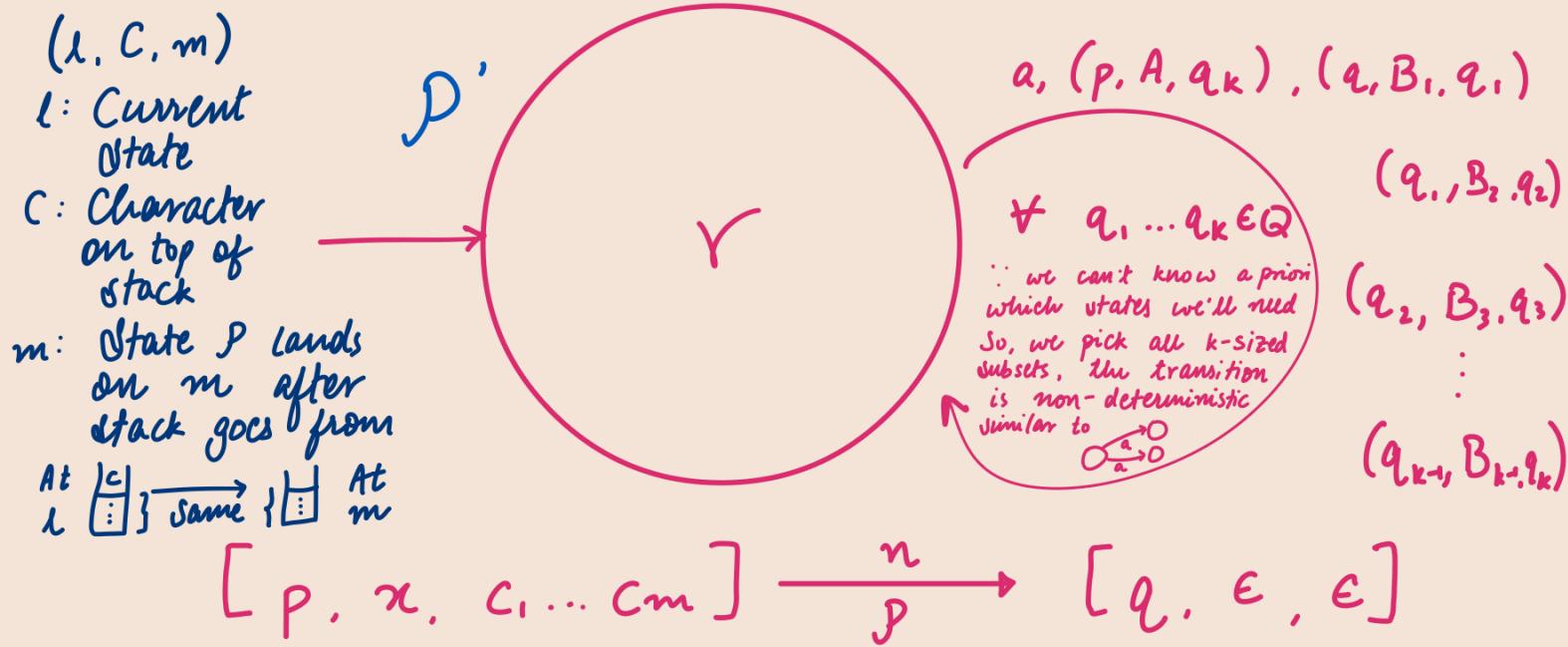
δ' :

$P = a, A, B_1, \dots, B_k$

If input is accepted then ∃ a moment where



This transition is captured as such:



PDA P , in state p , on reading input x with stack $c_1 \dots c_m$, in n steps moves to state q with no input left and an empty stack.

Thm: P accepts a string s iff P' accepts string s .

Pf: By induction on the number of steps n to show the following:

for any $p \in Q$, $x \in \Sigma^*$, $c_1 \dots c_m \in \Gamma^*$

$$[p, x, c, \dots, c_m] \xrightarrow{p} [q, \epsilon, \epsilon]$$

$$\Rightarrow \exists q_1 \dots q_{m-1} \in Q : [r, x, < p, c_1, q_1 > \\ < q_1, c_2, q_2 > \dots < q_{m-1}, c_m, q_m >] \xrightarrow{p'} [r, \epsilon, \epsilon]$$

If above is true, then

$$[q_0, x, \perp] \xrightarrow{p} [f, \epsilon, \epsilon] \quad \text{iff} \\ [r, x, < q_0, \perp, f >] \xrightarrow{p'} [r, \epsilon, \epsilon] \text{ for some } n > 0$$

Base Case: $n=1 \rightarrow$ Condition reduces to

$$[p, a, \perp] \xrightarrow{p} [f, \epsilon, \epsilon] \quad \text{iff } (a \in \Sigma \cup \{\epsilon\}) \\ [r, a, < p, \perp, f >] \xrightarrow{p'} [r, \epsilon, \epsilon]$$

Induction Step: Assume for n . Need to show:

$$[p, x, c, \dots, c_m] \xrightarrow{p} [f, \epsilon, \epsilon] \quad \text{iff} \\ [r, x, < p, c_1, q_1 > \dots < q_{m-1}, c_m, q_m >] \xrightarrow{p'} [r, \epsilon, \epsilon]$$

Suppose $[p, x, c, \dots, c_m] \xrightarrow{p} [f, \epsilon, \epsilon]$

This implies $\exists a \in \Sigma \cup \{\epsilon\}$, state $q \in Q$, and $B_1, \dots, B_k \in \Gamma$ such that:

- (i) $x = ay$
- (ii) $[p, ay, c, \dots, c_m] \xrightarrow{p} [a, y, B_1, \dots, B_k, c_1, \dots, c_m]$
- (iii) $[a, y, B_1, \dots, B_k, c_1, \dots, c_m] \xrightarrow{p} [f, \epsilon, \epsilon]$

Context Free Grammars

- Specified by a finite set of terminals, a finite set of non-terminals & a finite set of productions connecting terminals and non-terminals.

and non-terminals.

Terminals = $\Sigma \cup \{\epsilon\}$ → alphabet

represented by small letters

Non-terminals → intermediate symbols

represented as capital letters representing a set of strings over terminals

Productions → tells us how each non-terminal is translated to a set of terminals

$A \rightarrow \gamma, \gamma \in (\text{Terminals} + \text{Non-terminals})^*$

Ex: Consider $\{0^n1^n \mid n \geq 1\}$

$S \rightarrow 0S1, S \rightarrow 01$

$S \rightarrow 0S1 \rightarrow 00S11 \rightarrow 000S111 \rightarrow 00001111 = 0^41^4$

Ex: Arithmetic expressions using $+ - * /$ over integers

$S \rightarrow S+S; S \rightarrow S * S; S \rightarrow S-S; S \rightarrow S/S;$

$S \rightarrow (S); S \rightarrow I; S \rightarrow -I; S \rightarrow -S;$

$I \rightarrow 0I; I \rightarrow 1I; I \rightarrow 2I; \dots; I \rightarrow 9I;$

$I \rightarrow 0; I \rightarrow 1; I \rightarrow 2; \dots; I \rightarrow 9;$

Def: The set of strings of terminals generated by a context-free grammar (CFG) is called a context-free language (CFL).

Context-free: Production rules for a non-terminal are free of its context (left and right neighbours).

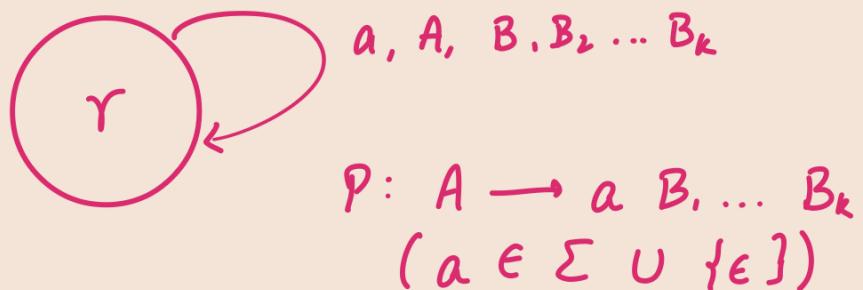
Counterpart is context-sensitive:

Theorem: A set of Σ^* is a **CFL** iff it is accepted by a **PDA**

Pf: Let $G = (\Sigma, \Gamma, P)$ be a CFG

\uparrow terminals \downarrow non-terminals \nearrow productions

- For each $a \in \Sigma$ introduce a new non-terminal N_a in Γ & new production $N_a \rightarrow a$ in P
- Convert every production $A \rightarrow \gamma$ of P by replacing any terminal in γ except the one that is the 1^{st} letter of γ by N_a corresponding to that a
- PDA



Pumping Lemma for CFLs

Let A be a CFL. $\exists n > 0$ s.t. for every $xuvwy \in \Sigma^*$ of length $> n$, the following holds:

- (i) $|uvw| \leq n$
- (ii) $|uw| \geq 1$
- (iii) If $xuvwy \in A$ then $xu^i v w^i y \in A \forall i$

Ex: $\{0^m 1^m 0^m \mid m > 0\}$ is not a CFL

Consider

$$0^n 1^n 0^n = xuvwy$$

(pump twice)

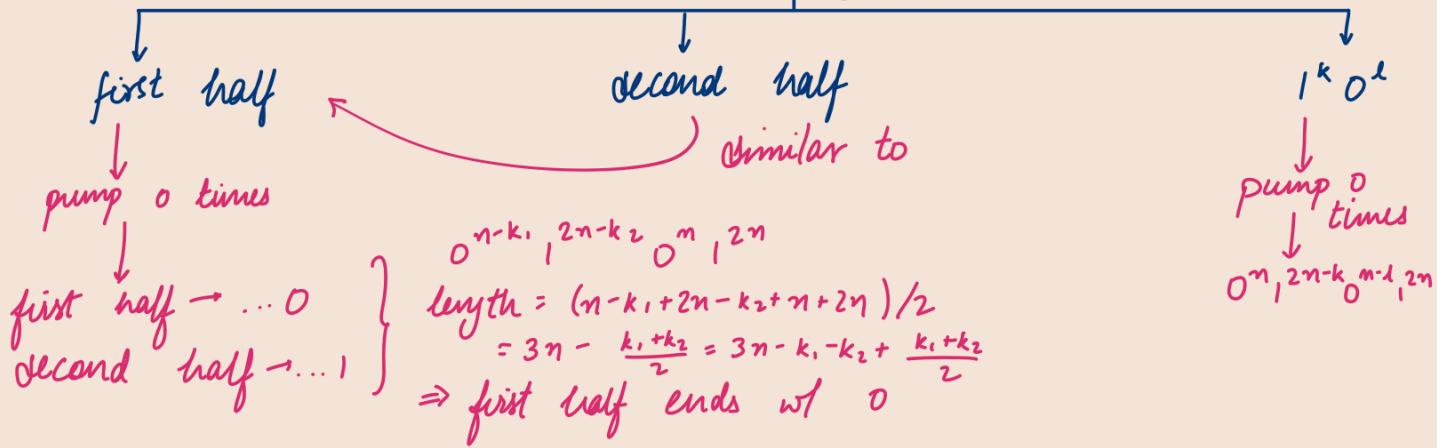
$0^{n+k} 1^n 0^n \xrightarrow{uw=0^k} 0^n 1^n 0^n \xrightarrow{uw=1^k} 0^{n+k} 1^n 0^n \xrightarrow{uw=0^k, w=1^k} 0^{n+k} 1^{n+k} 0^n$

$O^n |^{l'} O^k |^{l+2^k} O^n \leftarrow u = O^k |^{l'}, w = 1^{2^k}$
 $O^{n+k} |^{l} O^{k'} |^m O^n \leftarrow u = O^{k'}, w = O^{k'} |^l$
 can use $i=0 \rightarrow O^{n-k'} |^{n-l'} O^n, O^{n-k'} |^{n-l'-1^2} O^n, O^{n-k'-k'} |^{n-l} O^n$
Similar
to this case

Ex: $\{ww \mid w \in \{0,1\}^*\}$

Consider

$O^n |^{2^n} O^n |^{2^n}$
| uvw



- Given a CFL A and a string x , how to determine if $x \in L$?

Consider $CFG = (\Sigma, \Gamma, P)$ generating A

Chomsky Normal Form (CNF)

A $CFG (\Sigma, \Gamma, P)$ is in Chomsky Normal Form if every production in P has one of the following two forms:

$B \rightarrow a$

$B \rightarrow CD$

Converting a CFG to its (equivalent) CNF form:

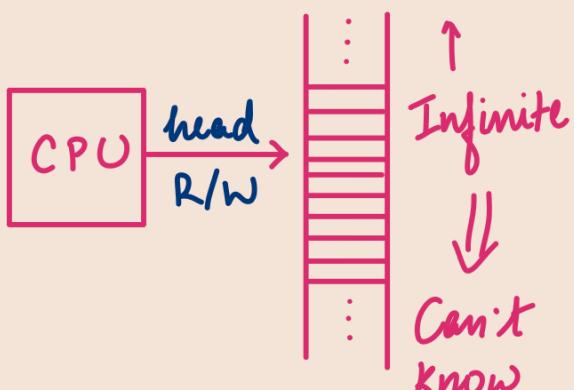
- For every $a \in \Sigma$, introduce a new production $T_a \rightarrow a$
- For every production $B \rightarrow \gamma$ in P , replace terminals in γ by newly introduced terminals unless $\gamma \in \Sigma$
- Productions now have the following forms:
 $B \rightarrow a, B \rightarrow C_1 C_2 \dots C_k, k > 1$
 $\cancel{B \rightarrow \epsilon} \rightarrow B \rightarrow C \rightarrow B \rightarrow CT_C \quad () \quad T_C \rightarrow \epsilon$

Replace by $B \rightarrow C.R.$
 $R_1 \rightarrow C_1 R_2, R_2 \rightarrow C_2 R_3,$
 $\dots R_{k-1} \rightarrow C_{k-1} C_k$

Replace each occurrence of B on RHS, by
enumerating all the possibilities:
Ex: $C \rightarrow Y_1 B Y_2 B Y_3 : C \rightarrow Y_1 B Y_2 B Y_3 | Y_1 B Y_2 Y_3 | Y_1 Y_2 B Y_3$

- The conversion is complete

- Idea: Given string $x \in \Sigma^*$, $x = a_1 a_2 a_3 \dots a_n$, compute the set of non-terminals T_{ij} that generate string $x_{ij} = a_i a_{i+1} \dots a_j$ for i, j .
- Computing $T_{i,i}$: Pick only those where $T \vdash a_i$
 $\Rightarrow T_{i,i} = \{C \mid C \rightarrow a_i \text{ is in } P(\text{productions})\}$
 - Computing $T_{i,i+1}$:
 $\Rightarrow T_{i,i+1} = \{C \mid C \rightarrow T_1 T_2, T_1 \in T_{i,i}, T_2 \in T_{i+1,i+1}\}$
 - Computing $T_{i,j}$: $i - j \geq 1$
 $\Rightarrow T_{i,j} = \{C \mid C \rightarrow T_1 T_2, T_1 \in T_{i,k}, T_2 \in T_{k+1,j}, k \in [i, j]\}$
 - Above computations are possible due to CNF
 - To check if $s \in A$, just check if $s \in T_{1,n}$.
Time complexity : $O(|s|^3 / |P| f(T)) \Rightarrow O(|s|^3)$
 - Time to check membership in set
 - # of Productions
 - Independent of s
 - The above algorithm is the **Cocke - Younger - Kasami (CYK) Algorithm**
 - Time complexity to check membership in a regular set : $O(|s|) \rightarrow$ Run it on a DFA

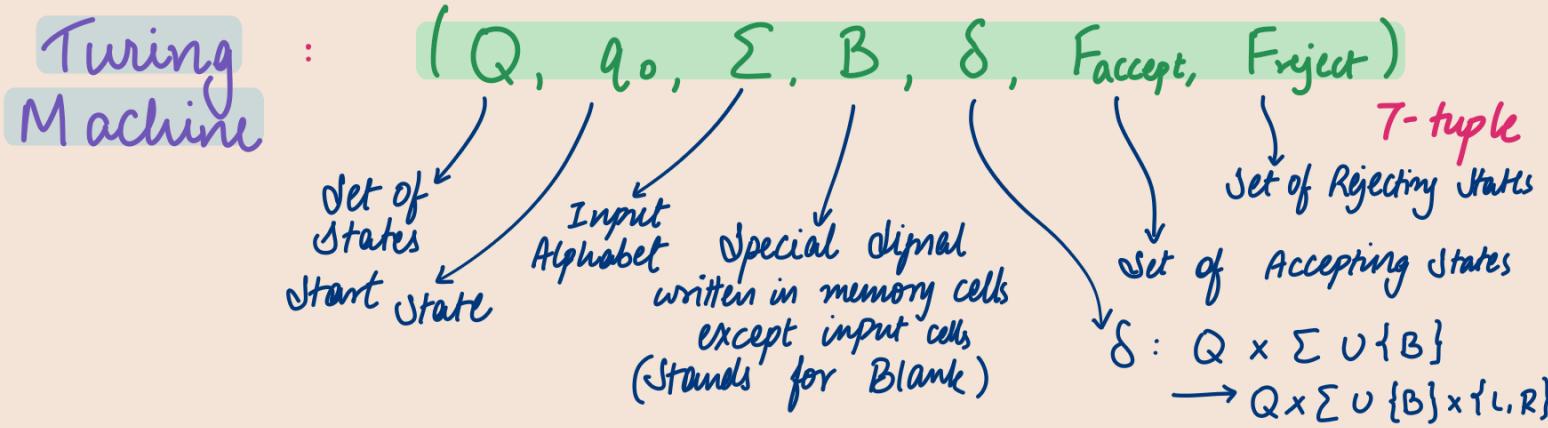


Transition from one state to another



if input ended
Need both accept + reject states as final states

- At the beginning of the computation, input is written as a contiguous finite state of memory, and head pointing to the leftmost input cell. Plus, the state is start-state.
- Usually, PC (program counter) can move any number of places, but allowing head to move just one place at a time is sufficiently powerful.
- * This computation model is called a **Turing Machine**



- Memory is called **tape** in Turing machines. Although we are studying an infinite tape, the memory in practice is finite.

Ex: $\{0^n 1^n 0^n \mid n \geq 1\}$

Alternatively,

- Use two tapes/stacks.
- One tape: read head, other tape is write head.
- 0^n : fill w/ 0
- 1^n : fill w/ 1
- 0^n : fill w/ B

$O(n)$
but auxiliary space needed

$0^n \quad 1^n \quad 0^n$

→ Read a 0, replace it with a blank, go to the right end, write a C*, go to the left end. Repeat.

→ Read a 1, replace it w/ B, go to right end, write C*. go to left end.

→ Read a 0, replace it w/ B, go to right end, pop a C*, go to left end.

Need to take care, which end of the right "write" part, we write to, so that other inputs are not wrongfully accepted.

$O(n^2)$ +
but no auxiliary space needed

- Multitape TMs: A TM with k tapes, each with its own head. Transitions done based on contents of all heads.
- Multitrack TMs: TMs with one tape that has multiple tracks, each with its own head.

Theorem: Multitape TMs are equivalent to multitrack TMs

- Multitrack TMs with one head: One head reading contents of all tracks in a cell simultaneously

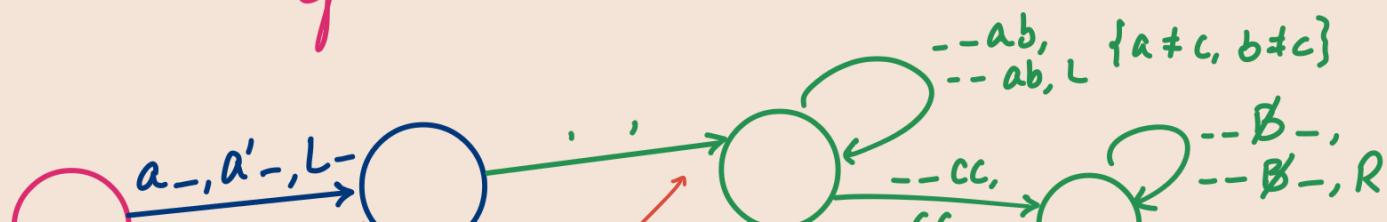
Theorem: Multitrack TMs are equivalent to Multitrack TMs with one head.

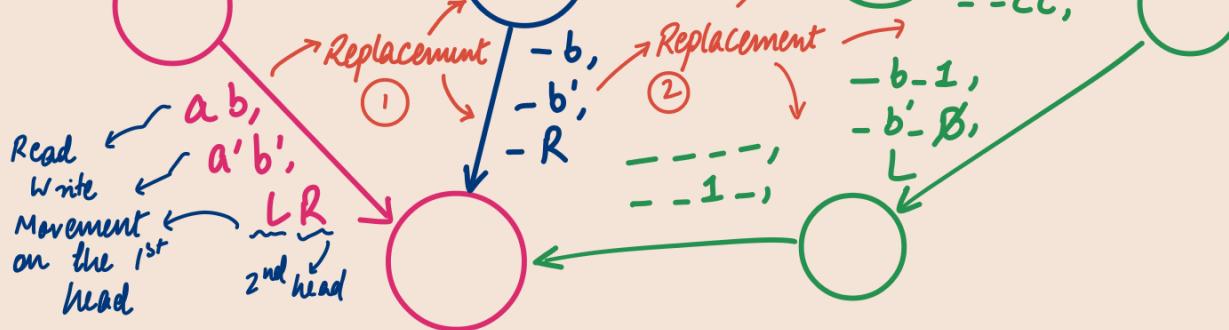
Proof:

Consider a 2-track TM with 2 heads



- Break down simultaneous reads/writes into partial ones
 - Might introduce some non-determinism
- For an operation doing an r/w in a single track, go to the left (identified by $--CC$) ; then keep going to the right until a ' 1 ' is encountered; do the r/w ; update the track recording the head.
- In terms of the state table





- Need to be careful when the original TM writes on the left end: Shift $--CC$ to the left
- Also need to write $--CC$ initially on the left end before entering the initial state
- Assuming that the head is just to the left of the input stream
- This can be used to reduce any number of tracks:
 k heads \rightarrow Choose any two \rightarrow Combine them using above construction $\rightarrow k-1$ heads

Theorem: Multitrack TMs with one head are equivalent to single track TMs.

Proof: Change the alphabet by combining current alphabets



Theorem: One track, one head TMs are equivalent to one track, one head TMs with $\Sigma = \{0, 1\}$

Proof: Suppose $|\Sigma| = k$
 Let $l = \lceil \log_2 k \rceil$
 Code each symbol as l -bit binary sequence

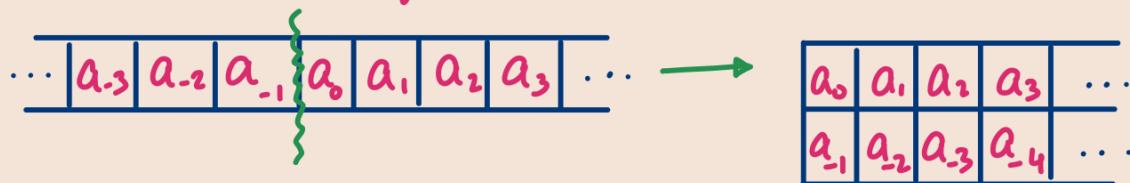
Theorem: TMs with $\Sigma = \{0, 1\}$ are equivalent to TMs with $\Sigma = \{a, b\}$

TMs with $\Sigma = \{0, 1\}$

Proof: Use B to view 0 as $0B$,
1 as $B0$, B as BB

Theorem: 2-way infinite TMs are equivalent to
1-way infinite TMs

Proof:



Church - Turing Thesis

Computability is exactly captured by TMs

Universal TMs

- Input is of the form (p, x)
- Simulates M on x and accepts iff M accepts x



* There exists a **Universal Turing Machine**

(UTM)

It takes as input $\langle p, x \rangle$ and accepts iff TM described by p accepts x .

TM description $p \Rightarrow p$ is a string \Rightarrow write p as a view p as a number \Leftarrow binary string

\therefore a TM can be viewed as a number $\Rightarrow 1, 2, 3, 4, \dots = N$ enumerates all TMs

Adopt convention that a number that does not correspond to a TM represents a TM that

rejects all inputs

Theorem: Number of subsets of $\{0, 1\}^*$ are uncountable

Proof: consider a real number in the range $[0, 1]$ and write it in binary notation and $[0, 1]$ is/ol homeomorphic to \mathbb{R} f tan func.)

Ex: 0.0100100...
represents 0 present
represents 1 present
5 present

The Halting Problem

$$H = \{(p, x) \mid \text{TM } p \text{ halts on input } x \text{ after finitely many steps}\}$$

Theorem: There is no TM that accepts H

Proof: Suppose TM M accepts H

Define another TM \bar{M} as:

On input (p, x) , if M accepts $(p, (p, x))$, go in an infinite loop.

If M rejects $(p, (p, x))$, accept

What does M do on input $\langle r, \langle r, x \rangle \rangle$?

M accepts $(r, (r, x))$

$\Rightarrow \bar{M}$ does not halt on (r, x)

$\Rightarrow M$ rejects $(r, (r, x))$

M rejects $(r, (r, x))$

$\Rightarrow \bar{M}$ halts on (r, x)

$\Rightarrow M$ accepts $(r, (r, x))$

$\therefore M$ does not exist

Def. Set A is decidable if \exists a TM that accepts all strings in A and rejects all strings in $\Sigma^* \setminus A$

Otherwise, set A is undecidable

- * **Halting** Set H is undecidable
- Given p , is there an input on which $\text{TM } p$ does not halt?
- Define $\hat{H} := \{p \mid \text{TM } p \text{ halts on all inputs}\}$
- Is \hat{H} decidable? NO

→ Suppose \hat{H} is decidable. Let q be the description of $\text{TM } M_q$ that accepts \hat{H} .

On input (p, x) , define a TM that works as follows:

$M_s \left\{ M_r \right\}$ On input y , ignores y , writes x on tape, and simulates M_p on input x .
 Runs M_q on input r and accepts (p, x) iff M_q accepts r .

M_s accepts $\Leftrightarrow M_q$ accepts $r \Leftrightarrow M_r$ halts on all inputs $(p, x) \Leftrightarrow M_p$ halts on $x \Leftrightarrow H$ is decidable
 $\therefore \hat{H}$ not decidable.

Q. Given a $\text{TM } p$, does it accept any string?

Undecidable. Towards contradiction, assume

M_q : TM that solves the problem

M_s : On input $\langle p, x \rangle$, generates r , accepts $\langle p, x \rangle$ iff M_q accepts r .

M_r : On input y , erase y , run M_p on x and do as it does.

Now, if M_p accepts input x , then M_r accepts Σ^* , otherwise ϕ ; Feed r to M_q , it can tell whether M_r accepts any string or not, but then we know if p halts on x or not \Rightarrow Halting problem solved

$\Rightarrow \Leftarrow \therefore$ The question is undecidable

Q. Given TM p , does it accept strings only in O^* ?
Undecidable. Suppose M_q does the task.

M_s : Given $\langle p, x \rangle$, generate r , accept iff M_q accepts r .

M_r : Given y , erase y , if M_p halts on x .
As before, M_r either accepts Σ^* or ϕ .

Now, feed r into M_q , rejects $r \hookrightarrow M_p$ halts on x $\hookrightarrow M_q$ accepts r
 M_q . If M_q rejects r , then M_s will accept $\langle p, x \rangle$, else reject
 $\Rightarrow M_s$ can solve the halting problem.

Q. Given a TM p , does it accept O ?

Undecidable. Same construction as before.

Q. Given a TM p , and a state q_i of M_p , is there an input x such that M_p never comes to q_i on x ? Undecidable.

Suppose M_q solves the problem.

On input $\langle p, x \rangle$, construct r in a similar way. Feed r to M_q along with $(q_i \xrightarrow{r} q_f)$. Then, it is the same as asking if r accepts anything. But, this was undecidable $\Rightarrow M_q$ does not exist.

Q. Given a TM p , state q_i of M_p , does there $\exists x$ s.t. M_p comes to state q_i on x ?

Undecidable. Negation of prev. statement.

Q. Given a TM p and number n , is there an input x of M_p such that M_p runs on x

for more than n steps?

Decidable.

- 1) Run M_p on all inputs of length $< n$. If it takes more than n steps on any, accept.
- 2) Run M_p on all inputs of length $= n$. If it takes more than n steps or crosses the rightmost bit of input, accept.
- 3) Reject otherwise. Because, the TM does not even consider the complete input. So, all inputs of length $> n$ can be replaced by their prefix (of length $= n$).

Q. Given a TM p and number n , decide if M_p has more than n states.

Decidable. Just look at the encoding of M_p .

* In all of the above [undecidable] problems, the constructions were actually reductions, where an instance of Halting problem ($\langle p, x \rangle$) was reduced to an instance of the given problem.

Consider any property of computable sets.

Define it as:

P : Collection of all $\xrightarrow{\text{computable sets}} \{T, F\}$

* Property P is non-trivial if it does not assign same value to all computable sets.

Rice's Theorem: For any non-trivial property P , checking if it holds for a given TM M_p as input, is undecidable.

PF. Assume $P(\emptyset) = \text{false}$ (let $x \in \{0, 1\}^*$ s.t. $P(x)$

Pf.: Suppose $\exists \varphi$ - false. i.e. $x = 1, 0, 1^*$ s.t. $p(x)$ is true. Suppose M_q decides property P . Otherwise, talk about \bar{P} . Define TMs M_s as:

On input (p, x) , construct description of a TM r that works as follows: $L(M_r) = x$ or $L(M_r) = \emptyset$

On input y , run M_p on x . If it halts, run TM for x on y and accept iff $y \in x$

Run M_q on r and accept (p, x) iff M_q accepts r .

$\rightarrow M_s$ feeds r into M_q $\rightarrow M_q$'s decision on r helps M_s solve the halting problem for $\langle p, x \rangle$.
A contradiction $\Rightarrow M_q$ does not exist

Reduction: Given sets $A, B \subseteq \{0, 1\}^*$, we say that A reduces to B if \exists a function $f: \{0, 1\}^* \rightarrow \{0, 1\}^*$ such that:

- 1) f is computable
- 2) $x \in A \iff f(x) \in B$

Lemma: Suppose A reduces to B and A is undecidable. Then B is also undecidable.

In the previous example, Halting problem was reduced to a property P if M_s reduced $\langle p, x \rangle$ to r produced r from $\langle p, x \rangle$

Q. Is there a TM that outputs itself?

Yes. Consider the following TMs:

$M_a :=$ On input y , output $s(y)$ where,

$M_s(y) :=$ On any input, outputs y .

$M_b :=$ On input y , outputs $s(y) \uparrow y$.

Concatenation of \leftarrow

- Now, consider $M_{s(b)} \parallel b$:
- $M_{s(b)}$ receives input, erases it, writes b . Now, M_b receives b as input & outputs $s(b) \parallel b$. Thus, $M_{s(b)} \parallel b$ reproduces itself.
 - These TMs are not used for sets, rather, they compute functions.



* Application of reduction:

Is FOL (first order logic) decidable?

- { The domain of some quantifiers might be infinite, in that case, give it as a TM as well }
- No, it is not decidable because if it were, it would solve the halting problem \therefore the halting problem reduces as such:

M_p halts on x iff $\exists t H(p, x, t)$
where $H(p, x, t) :=$ TM M_p halts on input x within t steps

Some important Results

- Turing Recognizable:** Set L is called so if \exists TM M s.t. M accepts (and thus halts) $\forall x \in L$. For $x \notin L$, it may not halt, or it may reject.
- Decidable:** Set L is called decidable if \exists a halting TM M that accepts it.
- Halting TM:** TM that halts on all inputs (accepts or rejects each input).
- Undecidable:** As expected.
- Thm:** \exists a TM unrecognizable language.
 $L = \{s_i \mid M_i \text{ does not accept } s_i\}$
- Thm:** \exists an undecidable language.

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

Pf: Suppose H decides A_{TM} . Construct N as follows:
 Input is a TM $\langle M \rangle$. Simulate H on $\langle M, \langle M \rangle \rangle$.
 If H rejects, accept. If H accepts, reject.
 H is a halting TM $\Rightarrow N$ is a halting TM.
 Feed $\langle N \rangle$ to N :

N accepts $\langle N \rangle \Leftrightarrow H$ rejects $\langle N, \langle N \rangle \rangle \Leftrightarrow N$ doesn't accept $\langle N \rangle$

• Thm: Halting Problem (set) is undecidable.

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

Pf: H accepts H_{TM} . Construct H' :

Input $\langle M, \langle w \rangle \rangle$: Simulate H on $\langle M, \langle w \rangle \rangle$. If H rejects, reject. Else, run M on $\langle w \rangle$ and do as M does. Observe how H' is a halting TM.

$\therefore H'$ decides A_{TM} . $\Rightarrow \Leftarrow$

• L is TR & $\Leftrightarrow L(\bar{L})$ is decidable

\bar{L} is TR

\Rightarrow Run $M_L \& M_{\bar{L}}$ concurrently.

• Corollary: L is undecidable & TR $\Rightarrow \bar{L}$ is non-TR

• Co-TR := $\{ L \mid \bar{L} \text{ is TR} \}$

• $L_1 \leq_m L_2$: L_1 reduces to L_2 under computable function f such that: $x \in L_1 \Leftrightarrow f(x) \in L_2$

* $L_1 \leq_m L_2 \Rightarrow$ 1) L_2 decidable $\Rightarrow L_1$ decidable

2) L_1 undecidable $\Rightarrow L_2$ undecidable

3) L_1 non-TR $\Rightarrow L_2$ non-TR 4) L_2 TR $\Rightarrow L_1$ TR

• $\overline{A_{TM}}, \overline{H_{TM}}$ are non-TR

• $\overline{A_{TM}} \leq_m E_{TM}$: $E_{TM} = \{ \langle M \rangle \mid M \text{ is a TM} \& L(M) = \emptyset\}$

Construct f taking $\langle M, w \rangle$ & producing M' s.t.

M does not accept $w \Leftrightarrow L(M') = \emptyset$

M' : Input w . $w \neq x \Rightarrow$ reject. Else simulate M on w & do as it does.

$\Rightarrow L(M') = \{w\} \text{ or } \emptyset$

$E_{TM} \leq_m E \cap_{TM} = \{ \langle M_1, M_2 \rangle \mid L(M_1) = L(M_2) \}$

f takes M as input, $M_1 \leftarrow M$ & M_2 rejects all inputs, ie, $L(M_2) = \emptyset$.

$$L(M) = \emptyset \Leftrightarrow L(M_1) = \emptyset \Leftrightarrow L(M_1) = L(M_2)$$

$\overline{A_{TM}} \leq_m REG_{TM} = \{\langle M \rangle \mid L(M) \text{ is regular}\}$

f constructs M' from $\langle M, w \rangle$: M' simulates M on w & rejects if rejected. Otherwise, check if input $x = 0^n 1^n$ & accept, else reject.

M accepts $w \Rightarrow L(M') = \{0^n 1^n\} \Rightarrow$ Not regular

Else $L(M') = \emptyset$ which is regular

$EQ_{TM} \leq_m CON_{TM} = \{\langle M_1, M_2, M_3 \rangle \mid L(M_1) = L(M_2) \cdot L(M_3)\}$

f takes $\langle M_1, M_2 \rangle$, M_3 only accepts E .

$EQ_{TM}, EQ_{TM}, REG_{TM}, CON_{TM}$ are all non-TR.

$L_1 \leq_m L_2 \Rightarrow \overline{L}_1 \leq_m \overline{L}_2$

Time-Bounded TMs

What can be computed in reasonable time?

Polynomial time ← What is this? ↗

Polynomial-time computations

A TM that on input of size n , runs for at most $c \cdot n^k$ steps, for constants c & k .
 $\xrightarrow{O(n^k)}$

- * Any non-trivial computation will take time $\geq n$ (simply to read input)
- Let P be set of all sets that can be solved in polynomial time. Let FP be the set of all functions that can be computed in polynomial time.
- Ex: $\{ \text{Sorting, Matrix Multiplication, Shortest Path, Max. Flow} \} \subseteq FP$
- Primality Testing ∈ P. Integer Factoring?

Problems not in P

- $D = \{(i, x) \mid \text{TM } M_i \text{ rejects } (i, x) \text{ w.l.o.g. in } |x|^i \text{ steps}\}$
- D is a computable set but $D \notin P$.
- Suppose $D \in P \Rightarrow \exists \text{ TM } M_j \text{ accepting } D \text{ & runs for at most } c \cdot n^k \text{ steps.}$
- $(j, x) \in D \Leftrightarrow M_j \text{ rejects } (j, x) \text{ w.l.o.g. in } |x|^j \text{ steps}$
 $\Leftrightarrow \underline{M_j \text{ rejects } (j, x)}$ w.l.o.g. in $c|x|^k$ steps
 $\Leftrightarrow (j, x) \notin D \text{ for } |x| \geq c$
- $j > k$ ruled. If $j \leq k$ then add superfluous states to M_j to pump j up.

Examples of problems not known to be in P

1) Satisfiability

$F = C_1 \wedge C_2 \dots \wedge C_m$, $SAT = \{F \mid \exists x_1 \exists x_2 \dots \exists x_n F\}$
 $\hookrightarrow CNF$

2) Hamiltonian Cycle

$HAM = \{G \mid G \text{ has a Hamiltonian Cycle}\}$

3) Traveling Salesman Problem

(Shortest path version)

4) Sudoku ($n^2 \times n^2$)

$SUD = \{\text{puzzles that have a solution}\}$

5) Vertex cover

$VC = \{(G, k) \mid G \text{ has a vertex cover of size } \leq k\}$

The Class NP

Set $A \in NP$ if \exists a ND poly. time TM accepting it.

Thm: SAT, HAM, SUD, VC are in NP.

* We know that $P \subseteq NP$

It is conjectured that $P \neq NP$

$\therefore P \neq NP$
Hypothesis

Set A is said to be NP-Hard if $\forall B \in NP$,
 \exists a poly-time computable func. f . s.t.
 $\forall x: x \in B \text{ iff } f(x) \in A$.
i.e., $B \leq_m A$

Thm. Assuming $P \neq NP$, if A is NP-Hard, then $A \notin P$
Pf: If $A \in P \cup \{NP\}$, then $\nexists B \in NP \exists$ poly time reduction
 f s.t. $x \in B \rightarrow f(x) \in A$ can be solved in poly time
 $|f(x)| \leq p(|x|)$. Let Algo. for A run in $q(n)$
time, then we have a $q(p(n))$ time algo for
arbitrary $B \in NP \Rightarrow B \in P \Rightarrow P=NP$

Thm. SAT is NP-Hard

Pf: Let M be a ND polytime TM

$M = (Q, \Sigma, q_0, \delta, F_{accept})$. Consider input x w/ $|x|=n$.
 \hookrightarrow Runs for $\leq p(n)$ steps. Define the following literals:

State (q, t) : $q \in Q \wedge 0 \leq t \leq p(n)$

TM is in state q at time t

Head (j, t) : $1 \leq j \leq p(n), 0 \leq t \leq p(n)$

Head of M at time t points to j^{th} cell

Tape (s, j, t) : $1 \leq j \leq p(n), 0 \leq t \leq p(n), s \in \Sigma$

Value of j^{th} cell at time t is symbol s

For $t=0$:

size $\left\{ \begin{array}{l} \text{State}(q_0, 0) \wedge \text{Head}(1, 0) \wedge \text{Tape}(1, x[1], 0) \wedge \\ \dots \text{Tape}(n, x[n], 0) \wedge \text{Tape}(n+1, B, 0) \dots \wedge \text{Tape}(p(n), \emptyset, 0) \end{array} \right.$

For t :

$\forall q: \text{State}(q, t) \Rightarrow \neg \text{State}(q', t) \quad \forall q' \neq q$

$\forall j: \text{Head}(j, t) \Rightarrow \neg \text{Head}(j', t) \quad \forall j' \neq j$

$\forall j \forall s: \text{Tape}(j, s, t) \Rightarrow \neg \text{Tape}(j, s', t) \quad \forall s' \neq s$

size = $p(n) * (\underbrace{|Q|^2}_{q,q'} + \underbrace{p^2(n)}_{j,j'} + \underbrace{p(n)}_t * \underbrace{|\Sigma|^2}_{s,s'}) = O(p^3(n)) \quad \left\{ \begin{array}{l} \text{::: } |Q|, |\Sigma| \\ \text{independent} \end{array} \right.$

For $t > 0$:

$\# j \# q \# s$
 $\{ \Rightarrow [\text{State}(q, t) \wedge \text{Head}(j, t) \wedge \text{Tape}(j, s, t)]$
 $\vee [\text{State}(q_1, t+1) \wedge \text{Head}(j_1, t+1) \wedge \text{Tape}(j_1, s_1, t+1)]$
 $\vee [\text{State}(q_2, t+1) \wedge \text{Head}(j_2, t+1) \wedge \text{Tape}(j_2, s_2, t+1)]$
 $\vee \dots$
 All transitions $\leq \text{size} \leq \underbrace{p^2(n)}_{t \cdot j} \cdot \underbrace{|Q|}_{a} \cdot \underbrace{|\Sigma|}_{s} \cdot \underbrace{|Q|}_{\delta: \text{Transition table}} \cdot \underbrace{|\Sigma|}_{s} = O(p^2(n))$
 $\forall j \neq j' \neq j \neq s: \text{Head}(j, t) \Rightarrow [\text{Tape}(j', s, t+1) \Leftrightarrow \text{Tape}(j', s, t)]$
 $\forall q \in F: \text{size} = O(p^3(n)) = \underbrace{t \cdot j \cdot j' \cdot s}_{\text{size}}$
 $\forall \text{State}(q, p(n)) \rightarrow \text{size} = O(1) = |F|$
 So, polynomial reduction from any $B \in \text{NP}$ to SAT

★ This is the "Cook - Levin Theorem":

Thm: TM M accepts x , $|x|=n$, in $p(n)$ steps iff Formula F is satisfiable
 ★ If SAT $\in P$ then $NP = P$
 \Rightarrow SAT is NP-Hard

Def: Set A is NP-complete if A is NP-Hard and $A \in \text{NP}$

Thm: 3SAT, Clique, Independent Set, Vertex Cover, Hamiltonian Path, Undirected Hamiltonian Path are all NP-complete
 Pf: Checking membership in NP is fairly straightforward. Proving NP-Hard follows from the following reductions:

$SAT \leq_m 3SAT \leq_m IS \leq_m VC$, $3SAT \leq_m$ Clique,
 $SAT \leq_m VC \leq_m IS$, $3SAT \leq_m HP \leq_m UHP$