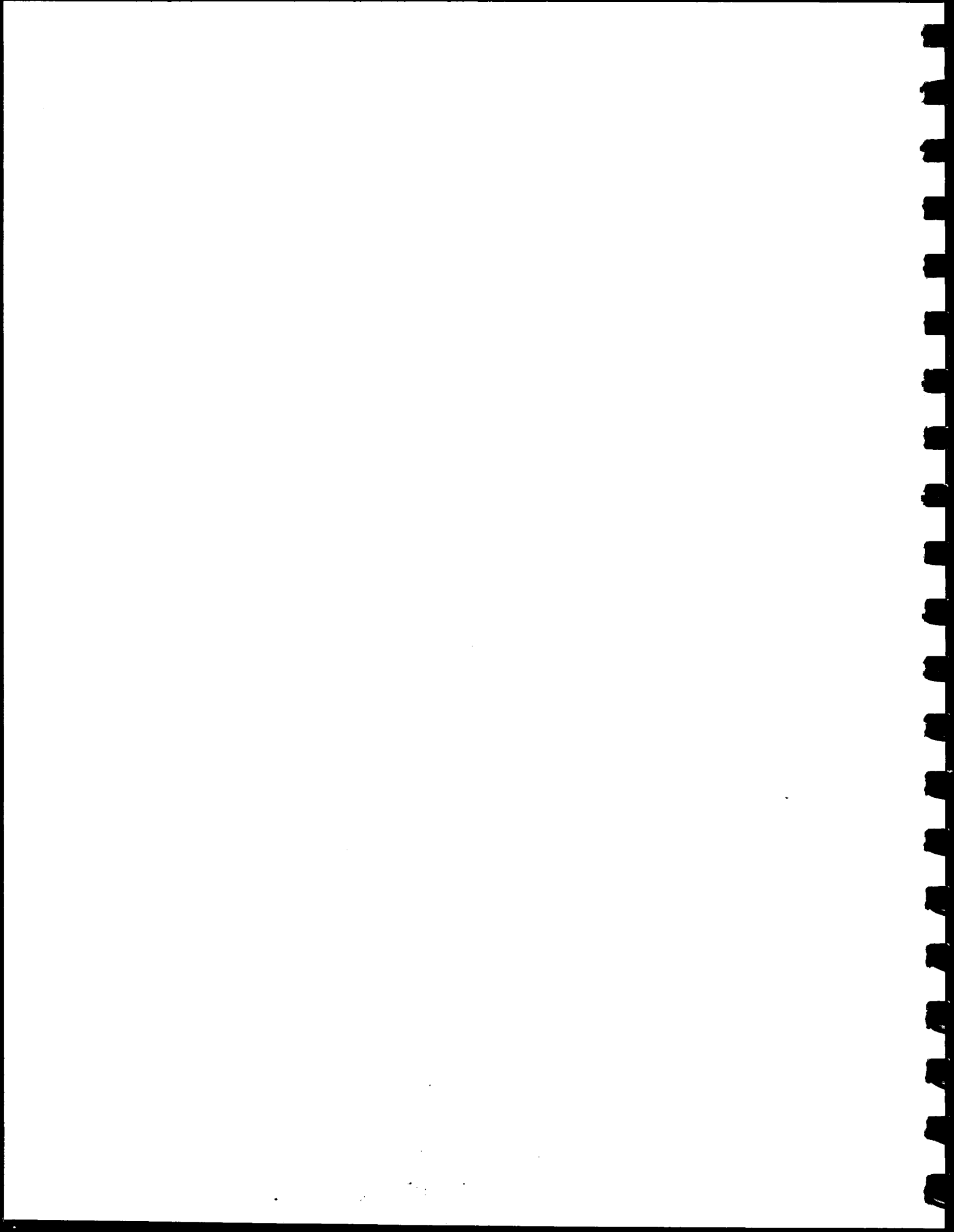
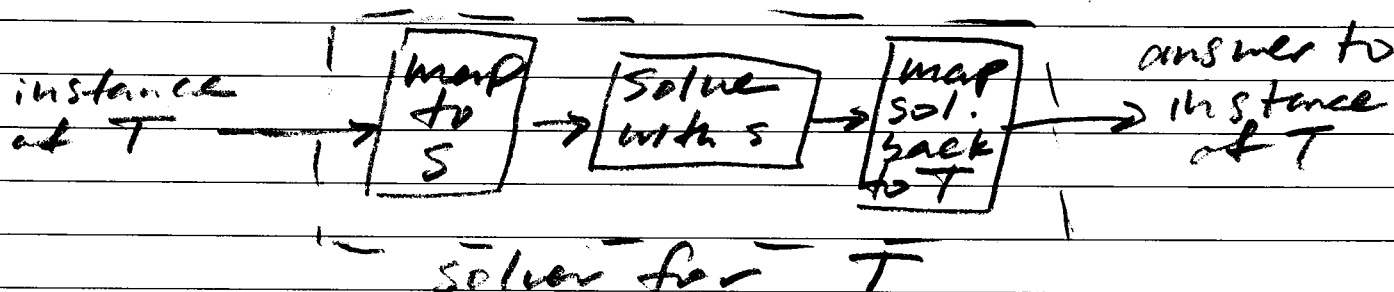




Theory of Computing

Date. 8.28.25
No. 2

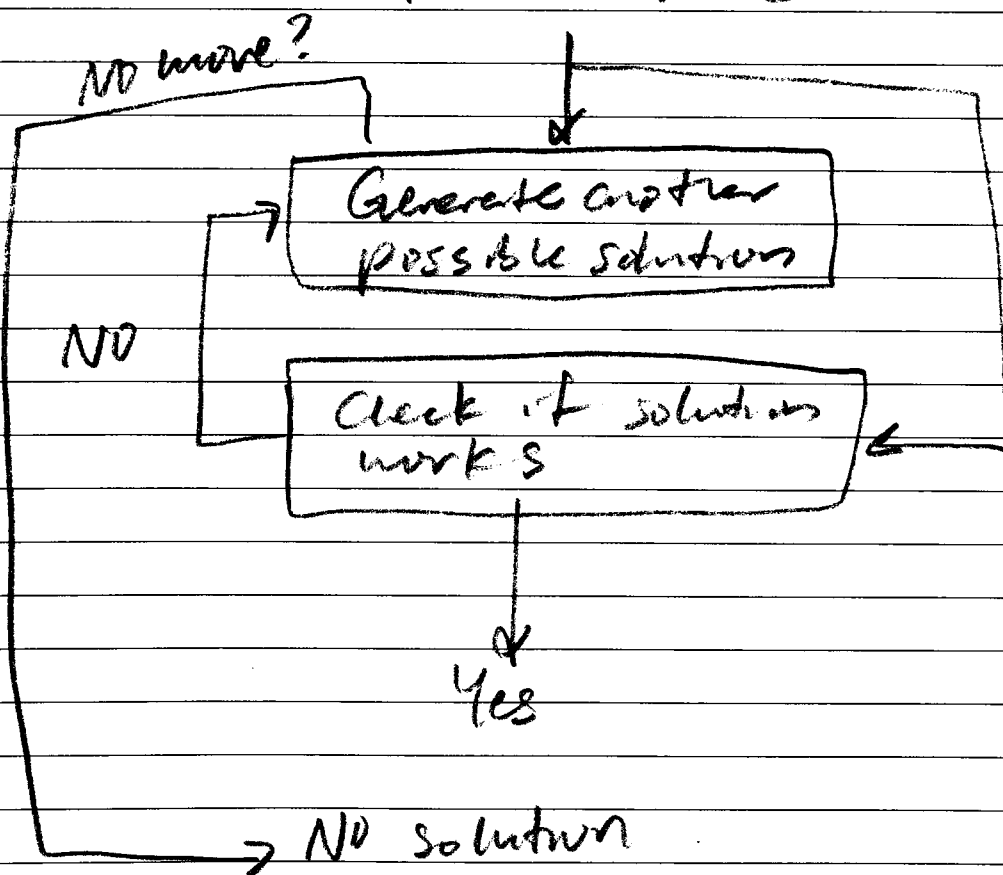
Suppose you have 2 problem classes S & T with solver f in S & T . If S can be used to solve T , what goes where?



called a Reduction: reducing problem T to S

Verifier: don't know how to solve problem, but can check if an answer is right

Problem Instance



and can enumerate all possible solutions

Objects: can be "compared"

• Numbers: N, W, Z, Q, R, C

$$\rightarrow W = \{0, 1, 2, 3, \dots\}$$

$$\rightarrow N = \{1, 2, 3, \dots\}$$

• Sets: unordered collection of objects

$\rightarrow P(A)$ = "power set" - set of all subsets

$\rightarrow$ written $\{a, b, c, \dots\}$ or $\{x \mid x \text{ has property}\}$

$\rightarrow \{\}$ or $\emptyset$ is an object

$\rightarrow$ operators $\parallel, \subseteq, \subset, \cup, \cap$

ex. $A = \{0, 1, 2\}$

$$P(A) = \{\emptyset, \{0\}, \{1\}, \{2\}, \{0, 1\}, \{0, 2\}, \{1, 2\}, \{0, 1, 2\}\}$$

$$|A| = n, P(A) = 2^n$$

• Tuples: ordered collection of objects

$\rightarrow k$ -tuple: $(a_1, a_2, \dots, a_k)$

$\rightarrow$ cartesian product: $A_1 \times A_2 \times \dots \times A_k$

set of all k -tuples $(a_1, a_2, \dots, a_k) \forall a_i \in A_i$

ex. $A_1 = \{0, 1, 2\}, A_2 = \{a, b\}$

$$(0, a), (1, a), (2, a), (0, b), (1, b), (2, b)$$

$$|A_i| = n_i$$

$$\prod_{i=1}^k |A_i|$$

• Strings : linear sequence of characters

→ Alphabet : Σ = set of chars in the string

→ Concatenation : join 2 strings

→ String projection : $\Pi_p(s)$: s without p

→ Kleene Closure : A^* = set of all strings from A

ex. $A = \{0, 1\}$

$A^* = \{0, 00, 000, \dots$

$01, 011, \dots$

$101, \dots$

$\vdots$ i.e. infinite

Graphs : defined by a tuple (V, E)

V : set of vertices

E : set of edges = $\{(u, v) \mid u, v \text{ are vertices}\}$

Weighted graph may have numbers on edges

defined by (V, E, W) st. $W(E) \in \mathbb{Z}$
 $\uparrow$ function

can be represented in an adjacency matrix

also has :

- subgraphs
- partitions
- cycles
- directed / undirected
- tree

No.

- Degree: # of edges that start/end with v
- Path: sequence of vertices connected by edges
- Circuit: path that starts/ends on same vertex
- Hamiltonian Path: circuit that goes through each vertex once
- Clique: subset of vertices that is fully connected
- Spanning Tree: subset of edges that touch all vertices w/o cycle
- K -colouring problem: K -link needs $2K$ colors

- k-place relation over sets $A_1, \dots, A_k$ is a subset of $A_1 \times A_2 \times \dots \times A_k$
 set of k-tuples

- Homogeneous relation: all A s are the same
- Heterogeneous relation: not

- Predicates: use of relation R to test if a tuple is in it

ex. $\text{ADD} = \{(x, y, z) \mid x, y, z \in \mathbb{Z} \text{ and } z = x + y\}$

- Binary Relations: relations formed from 2 sets
 $A \times B$

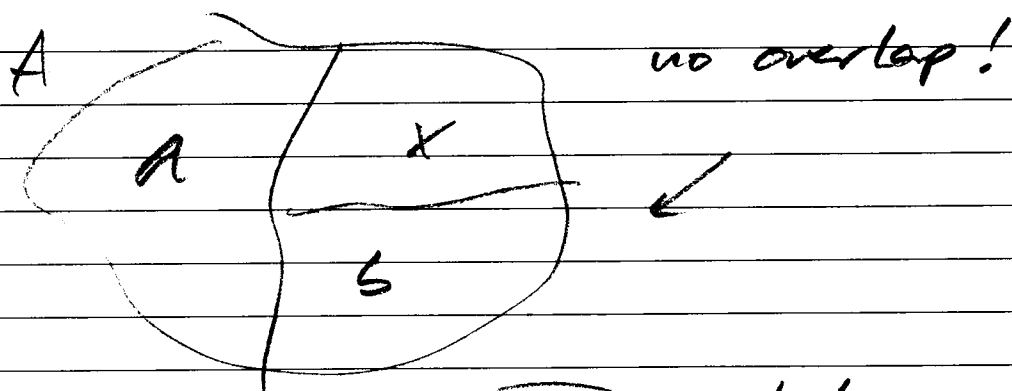
Properties of binary homogeneous relation R over $A \times A$

- Reflexive: $(a, a) \in R \quad \forall a \in A$
- Symmetric: $(a, b) \in R \rightarrow (b, a) \in R$
- Transitive: $(a, b) \in R$ and $(b, c) \in R$
 $\rightarrow (a, c) \in R$

Equivalence Relation: R has all 3 properties

• Partitions A into disjoint equivalence classes

$$V_a = \{a \mid (a, x) \in R\}$$



ex. $\{0, 1, \dots\} \text{ mod } 3$ relation

$$\begin{aligned} &\{(0, 0), (3, 0), (6, 0), \dots \\ &\quad (1, 1), (4, 1), (7, 1), \dots \\ &\quad (2, 2), (5, 2), (8, 2), \dots\} \end{aligned}$$

nice disjoint EC

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Functions: binary relation f over $A \times B$
written $f: A \rightarrow B$

- if $(a, b) \in f$ and $(a, c) \in f$ then $b = c$
- A is domain (may be cartesian product)
- B is range

Properties of some $f: A \rightarrow B$

- one-to-one: if $f(x_1) = f(x_2) \rightarrow x_1 = x_2$
- onto: $\forall b \exists a$ st $f(a) = b$

note. f is of $k \geq 1$ arguments domain

$$A = A_1 \times A_2 \times \dots \times A_k$$

$$\text{Ex. } \mathbb{Z}^+ = \{(a, b, c) \mid a, b, c \in \mathbb{Z}, c = a - b\}$$

Binary Functions: $k = 2$

IE, 1 object $\rightarrow$ 1 object

QQ. Assume you have 0 and a f that adds 1 to a number, how can you make 111?

$$3 = f(f(f(0)))$$

QQ. Assume you have 111, how can you build any $z \in \mathbb{Z}$?

$$(a, b) \equiv a - b$$

$$(0, 1) = -1$$

$$(1, 2) = -1$$

QQ. Assume you have 111, how can you make any $r \in \mathbb{R}$?

$$(a, b) \equiv \frac{a}{b} \text{ st } b \neq 0$$

Proof Techniques

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No. 03

Proof: a defensible argument that a statement is true

- Proof by Construction
- Proof by Contradiction
- Proof by Induction
 - base case: true for a_0
 - induction hypothesis: assume T up to a_k
 - induction step: prove for a_{k+1}

Construction: provide a method/program to create an object with a sought property

Contradiction: Assume P is false and show that creates a contradiction with something known as true

Induction: Show all elements of an enumerable infinite set with a "starting value" has some property

Ex. k -regular graph - each vertex has degree k

Prove: $\forall$ even $n \geq 2$, there is a 3-regular graph with n vertices

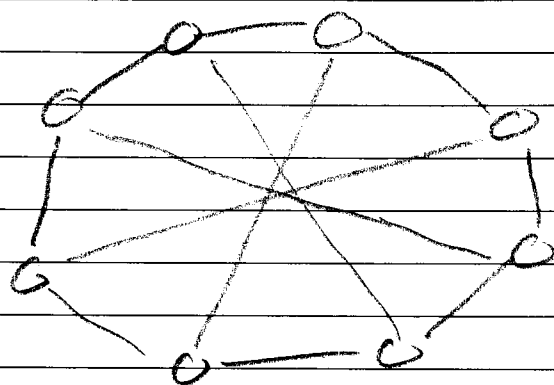
Proof by construction. $\forall n$, build a graph

- with n vertices $\{0, 1, \dots, n-1\}$ arranged in a circle (n even ≥ 2)
 - edges = $\left\{ (i, i-1) \mid 0 \leq i \leq n-2 \right\} \cup \{(n-1, 0)\} \cup \left\{ (i, i+n/2) \mid 0 \leq i \leq n/2-1 \right\}$ } these connect each vertex with 2 neighbours
this adds one more edge
- ie. graph w/ n vertices with degree 3 $\forall$ vertices

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$$n = 8$$



all vertices have degree 3

Ex. $a, b \in \mathbb{R}$. one of them $\neq 0$. then

$$\exists (c+di) \in \mathbb{Q} \text{ st } (a+bi)(c+di) = 1$$

Proof by Construction - $\forall a, b \in \mathbb{R}$, construct $c+di$

$$1. a+bi = \frac{1}{c+di}$$

$$2. \text{ But } \frac{1}{c+di} = \frac{1}{c+di} \cdot \frac{c-di}{c-di} = \frac{c-di}{c^2+d^2}$$

3. Solve for c and d where

$$a = \frac{c}{c^2+d^2} \quad b = \frac{-d}{c^2+d^2}$$

Proof by Contradiction:

$\forall x$ with property p , $f(x)$ has property q

Assume the opposite:

$\exists x$ with property p where $f(x)$ does not have property q

Show this leads to a contradiction

Ex. The sum of two even integers is always even

Assume. $\exists a, b$ not even st $a+b=c$ is not even

$$a+b=c$$

$$2w+2z=2x+1$$

$$w+z=x+\frac{1}{2} \notin \mathbb{Z}$$

contradiction.

Ex. The negative of any irrational is irrational

Assume. an irrational v where $-v$ is rational

Ex. $\sqrt{2}$ is irrational

Assume. $\sqrt{2}$ is rational

$$1. \sqrt{2} = \frac{m}{n} \quad \forall m, n \in \mathbb{Z}, n \neq 0,$$

2. m and n are fully reduced and have no common divisors

3. one must be odd (otherwise both divisible by 2)

$$4. n\sqrt{2} = m$$

$$5. n^2 2 = m^2$$

7. m^2 is even

8. m is even, must $= 2k$ $\forall k \in \mathbb{Z}$

$$9. n^2 2 = m^2 = 4k^2$$

$$10. n^2 = 2k^2$$

11. contradiction, both must be even

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Ex. Proof by Induction

Prove $\forall n, 1+2+\dots+n = \frac{n(n+1)}{2}$

Basis Step - $n=1$

$$1 = \frac{1(1+1)}{2} = 1$$

Hypothesis - true up to $n=k$

$$\text{ie. } 1+2+\dots+k = \frac{k(k+1)}{2}$$

Induction Step - show true for $n=k+1$

$$1+2+\dots+k+k+1 = (1+\dots+k) + (k+1)$$

$$= \frac{k(k+1)}{2} + (k+1)$$

$$= (k+1) \left(\frac{k}{2} + 1 \right)$$

$$= \frac{(k+1)(k+2)}{2} \quad \text{done}$$

SAT: Boolean Satisfiability

wff: well-formed-formula constructed from

- a set of Boolean variables
- Boolean operations

Satisfiability: $\exists$ a substitution of 0s and 1s to variables to make the wff true

Unsatisfiability: no substitution makes all clauses true at the same time

n variables $\rightarrow 2^n$ combinations

only need 1 case to be true!

CNF: Clausal Normal Form

- It is restricted as AND of a set of clauses
- each clause an OR of a set of literals
- each literal a variable or its negation

For a CNF to be true

- all clauses must be true
- for any clause to be true, at least one literal must be true

Ex. $(\neg x \vee y) \wedge (x \vee y) \wedge (x \vee \neg y)$

- $x=1, y=1$ makes expression true

Ex. $(\neg x \vee y) \wedge (x \vee y) \wedge (x \wedge \neg y) \wedge (\neg x \vee \neg y)$

- no assignment of vars makes this true
- unsatisfiable

note. can always convert to CNF

Applications:

- all computable functions can be converted to SAT problems
- if we can solve SAT quickly, we can solve all computable problems quickly
- this solution does not exist

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States & DFAs

SAT. Given expression using boolean variables and operators...

Is there an assignment to the values to the vars to make the expression TRUE

Satisfiable: at least one assignment gives TRUE

Unsatisfiable: no assignment gives TRUE

Tautology: every assignment gives TRUE

ex. $(A \vee B)$ - satisfiable $\{(1,0), (1,1), (0,1)\}$

note. N vars $\rightarrow 2^N$ assignments

ex. $(A \vee A)$ - tautology

ex. $A \wedge \bar{A}$ - Unsatisfiable

CNF: Clausal Normal Form

iff restricted as an AND of a set of clauses

- clause: OR of literals
- literal: var or its negation

1- SAT: all clauses have exactly 1 literal

ex. $x_1 \wedge x_2 \wedge x_3$

2- SAT: all clauses have at-most 2 literals

N-SAT: "

" at-most N literals

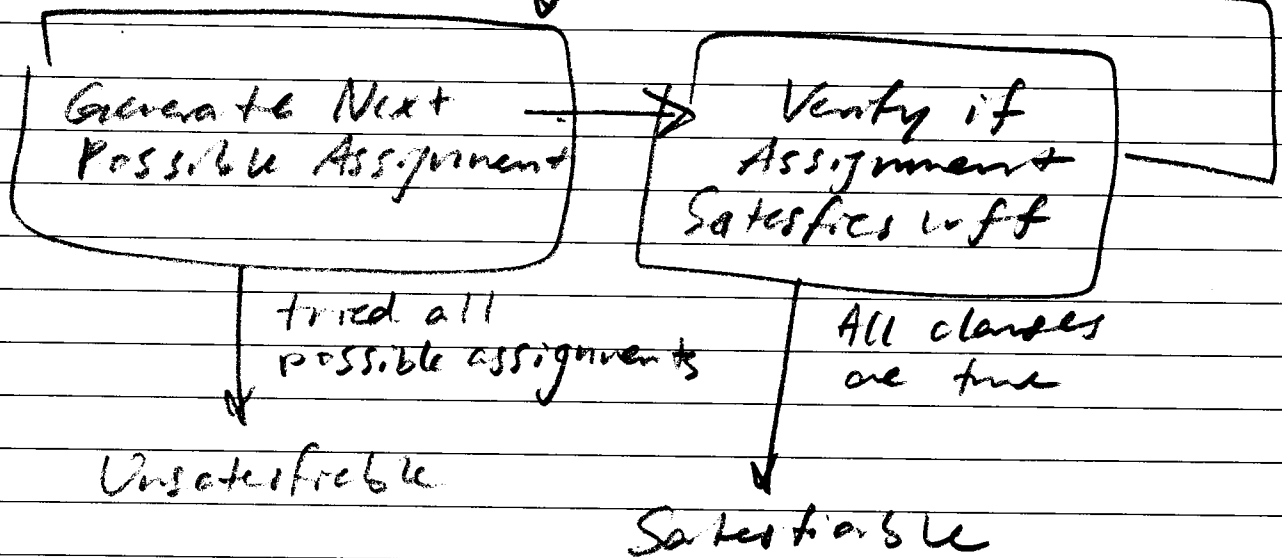
- at least one-literal in each clause must be true

World's Simplest SAT Solver: Truth Table!

but really slow, $O(2^N)$!

Brute-Force Approach:

WFF not satisfied



$$2^{|V|} \cdot |C| \cdot |L|$$

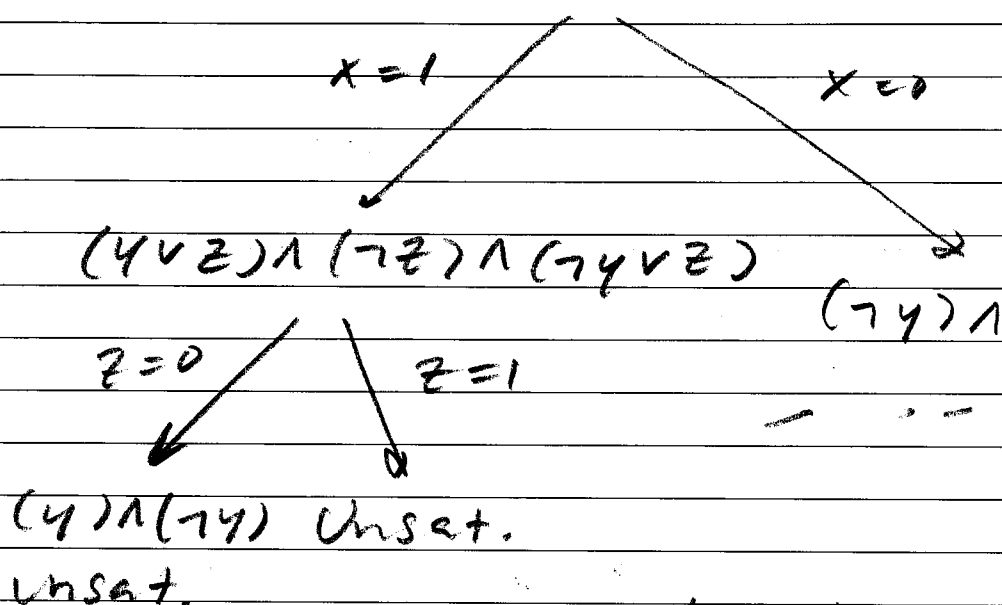
$\hookrightarrow$ # literals per clause
 $\hookrightarrow$ # clauses
 $\hookrightarrow$ # variables

Backtracking: improved SAT solver

• see AI notes!

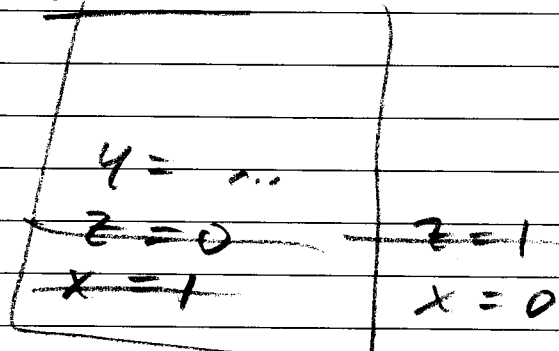
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Ex. $(x \vee \neg y) \wedge (y \vee z) \wedge (\neg x \vee \neg z) \wedge (\neg x \vee \neg y \vee z)$



i.e. tree traversal!

Stack.



The Unit Clause Rule:

When a clause only has one undetermined literal,
complexity greatly reduced

2-SAT can be linear!

k-SAT still worst case 2^k

State and Finite State Automata:

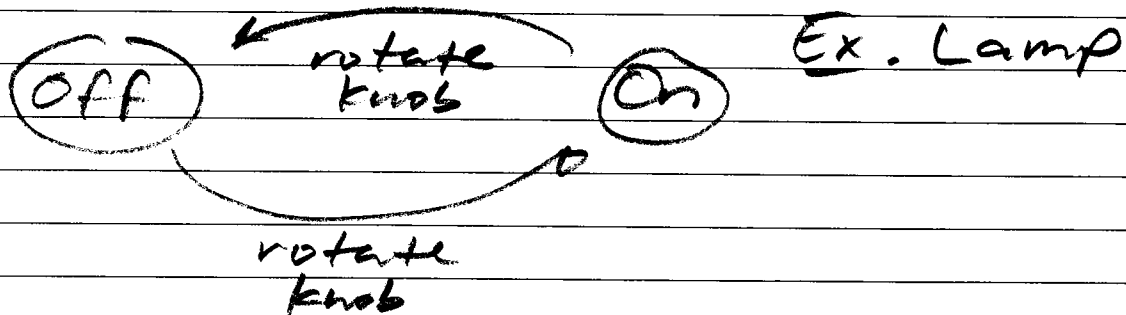
Goal 1. discussion of classical model, state, and computing w/ finite amount of state information

State. The condition (value) something is in at a specific time

Types of Systems:

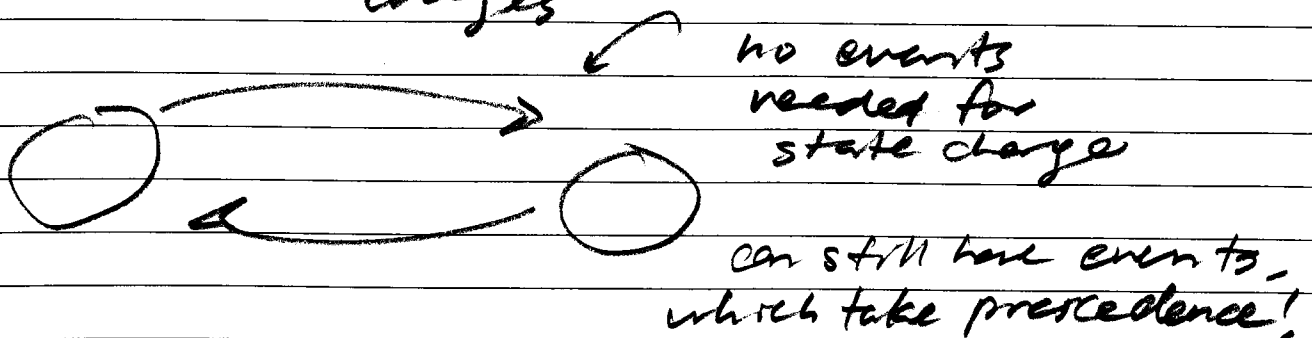
- Stateless System: combinational logic
- Continuous System: state of water level in a lake
- Sequential System: changes in state at specific times at only discrete values

"Clockless" Finite State Machines (FSM):



What we will study in this class

Clocked version: every "second", the state changes



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State Transition Table

two ways :

Current State	Next Input	New State
...	...	...

or

current state	input	...
state	new state	...
...		

Initial Deterministic Finite Automata (DFA)

5-tuple : $(Q, \Sigma, \delta, q_0, F)$

object

Q : set of states

Σ : set of input symbols

$\delta : Q \times \Sigma \rightarrow Q$: transition function

q_0 : initial state

F : set of final (or accept) states

- halt when we reach these states

- double circle on state diagram

* given pair (q_i, w_i) return a row q_{i+1}

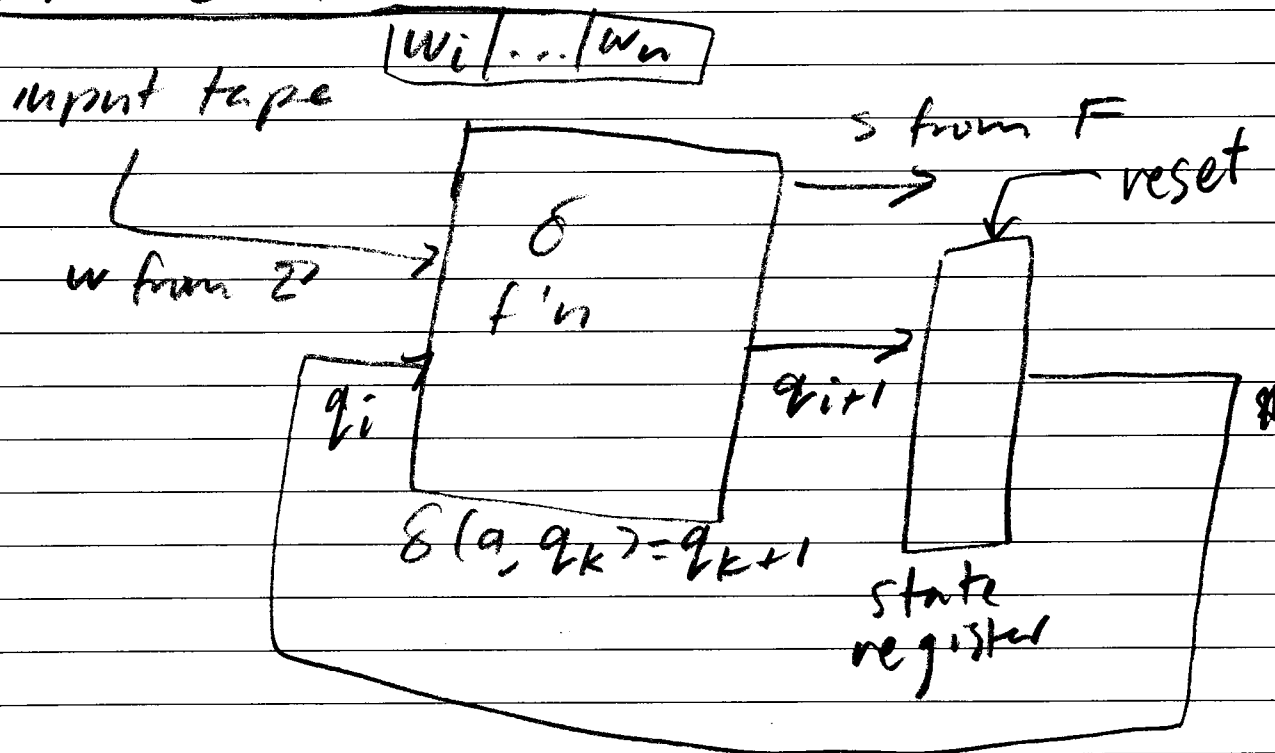
FSTs and Regular Language

Date. 9.9.25
No. 05

Aside. $\forall n$ if $P(n)$ then $Q(n)$

By contradiction
Assume $\exists n$ $P(n)$ is true,
and prove $Q(n)$ is false

Formal DFA Model:



s signal if q_i is in F

Recall. 5 tuple $(Q, \Sigma, \delta, q_0, F)$

note. if state in F when last symbol from input read, automaton has accepted input

i.e. machine stops at end of input

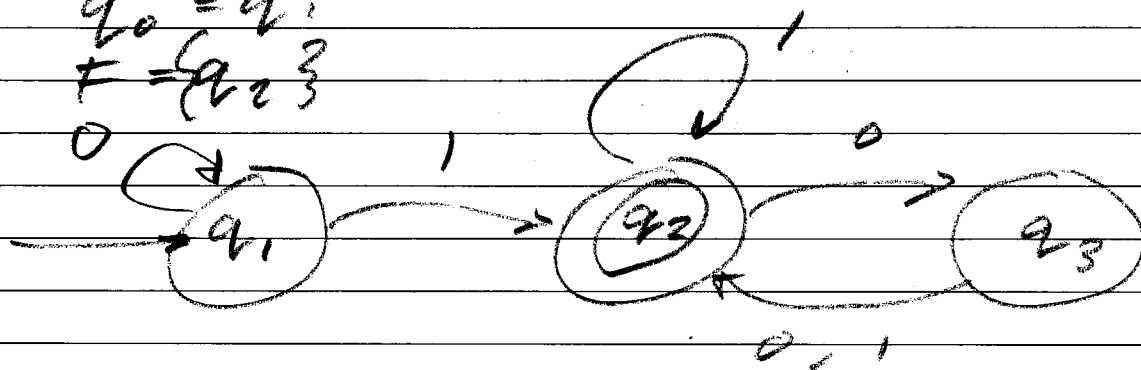
Ex. Sipser 1.4

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

$$\delta(a, q_k) = q_{k+1}$$

$$q_0 = q_1$$

$$F = \{q_2\}$$



current state	next input	next state
q_1	0	q_1
q_1	1	q_2
q_2	0	q_3
q_2	1	q_2
q_3	0	q_2
q_3	1	q_2

Under what conditions does it end in a final state?

strings to get to $F = \{1, 11, 1^+, 0^+1, 0^+1^+, (0 \leq 0, 1)^+ \}$

ie. $F = \{0^+1(1^+ \cup 1^+0^+ \{0, 1\}^+1^+)\}$

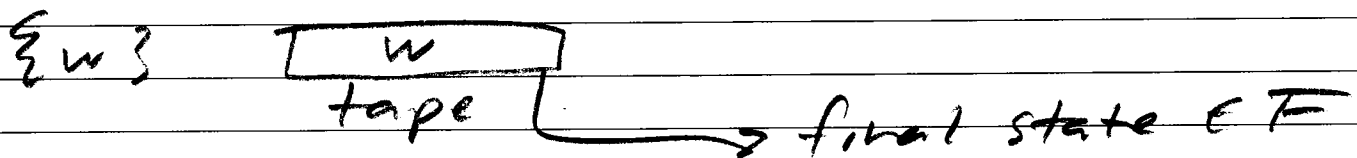
note. $n^+ \rightarrow$ 1 or more n's
 $n^0 \rightarrow$ 0 or more n's

note. can always convert these into code!

Finite Automata and Languages

- Language = set of strings
- FA M accepts a string if after last symbol, M is in F
- FA M rejects " " " not in F
- FA M recognizes language L if
 - M accepts all strings in L
 - M rejects all strings not in L

Notation: $L(M)$ = languages M accepts
(a set of strings)



Accepting a String:

M has states $Q = \{q_0, q_1, \dots, q_n\}$

Assume string $w = w_1, w_2, \dots, w_m$

Assume sequence of states $r_0, r_1, \dots, r_m$
 where:

$$r_i \in Q$$

$$r_0 = q_0$$

$$r_{i+1} = \delta(r_i, w_{i+1})$$

$$r_m \in F$$

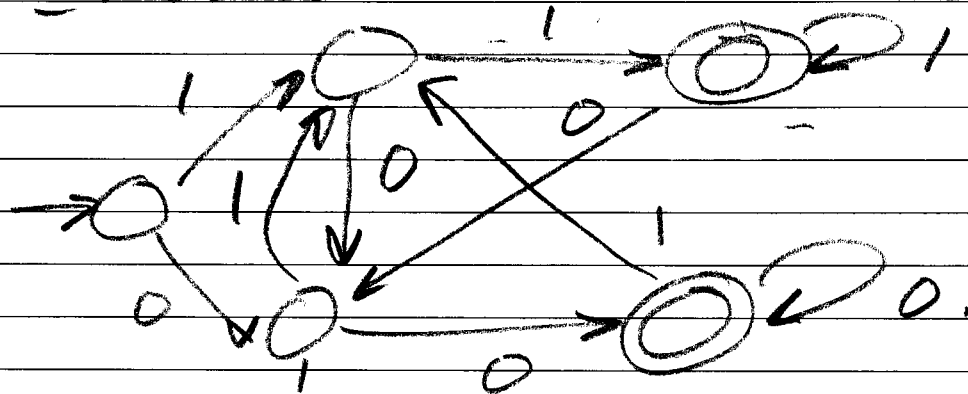
M accepts w

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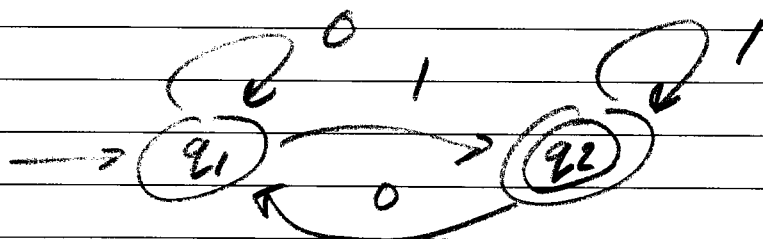
Ex. Draw a DFA which accepts when there is 00 or 11 at the end of a string from $\{0, 1\}^*$

ie. 01010100 but not 000111010



$$L(M) = \{0, 1\}^* (00 \cup 11)$$

Ex. What's the Language?

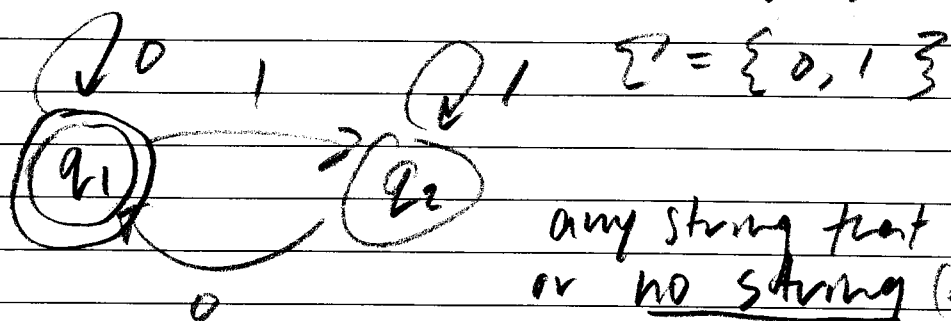


$$L(M) = \{0, 1\}^* 1$$

last char must be 1

Ex. 1.12 in worksheet

Ex. Sipser 1.10 - what's the Language?



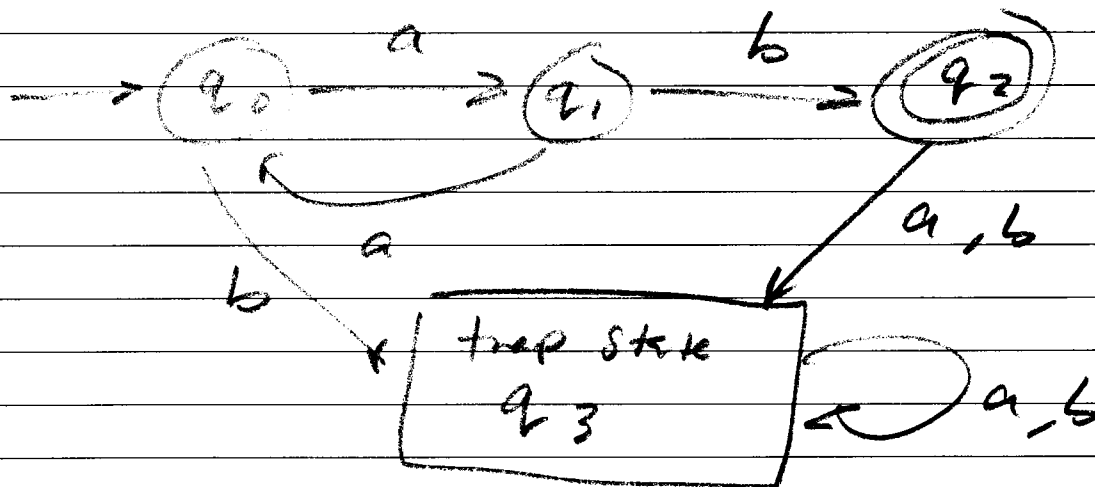
any string that ends in 0 or no string (empty string)

Trap States:

δ should include all combos of state from Q and symbols Σ

... But many don't care

a trap state is where the don't care's go, and once there all symbols loop back to there



language: odd # of a's followed by one b

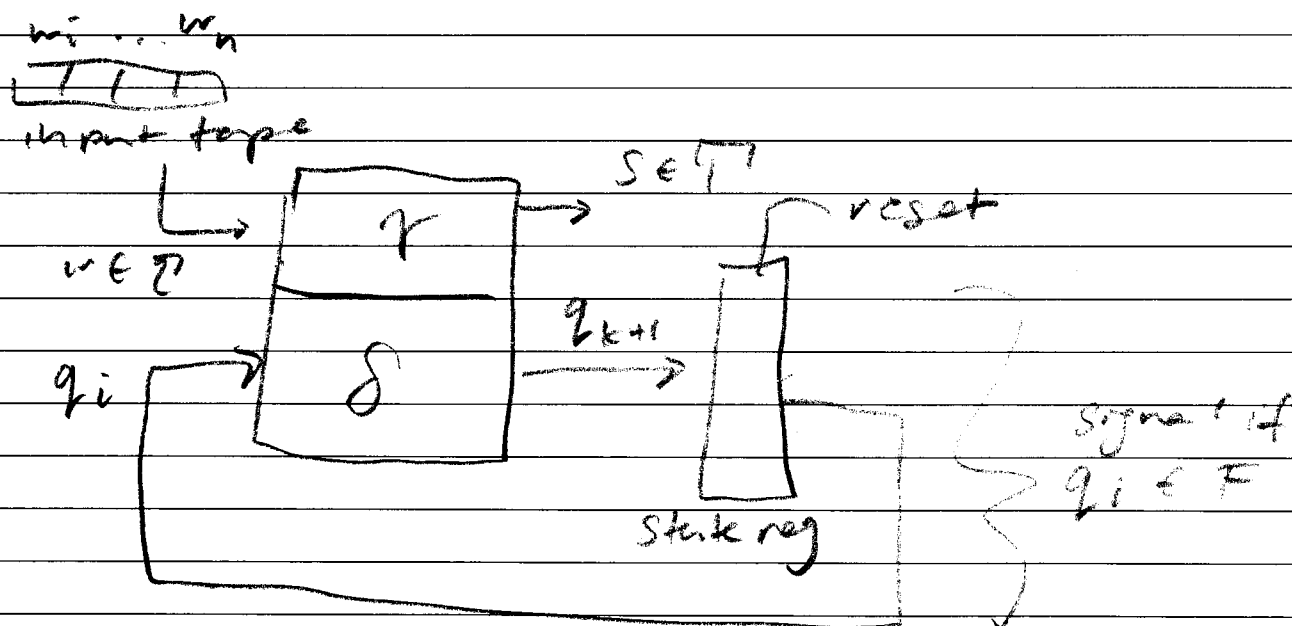
note. unless asked for, unused state transitions go to a trap state by default

Finite State Transducer (FST):

FA with separate "output"

7-tuple: $(Q, \Sigma, \delta, q_0, F, T, \gamma)$

- $Q, \Sigma, \delta, q_0, F$ from 'FA'
- T : set of output symbols
- $\delta: Q \times \Sigma \rightarrow Q \times T$
 - argument of δ is a pair
 - δ now returns a pair too



Function γ determines what symbol from T is output

Moore Machine: $\gamma: Q \rightarrow T$

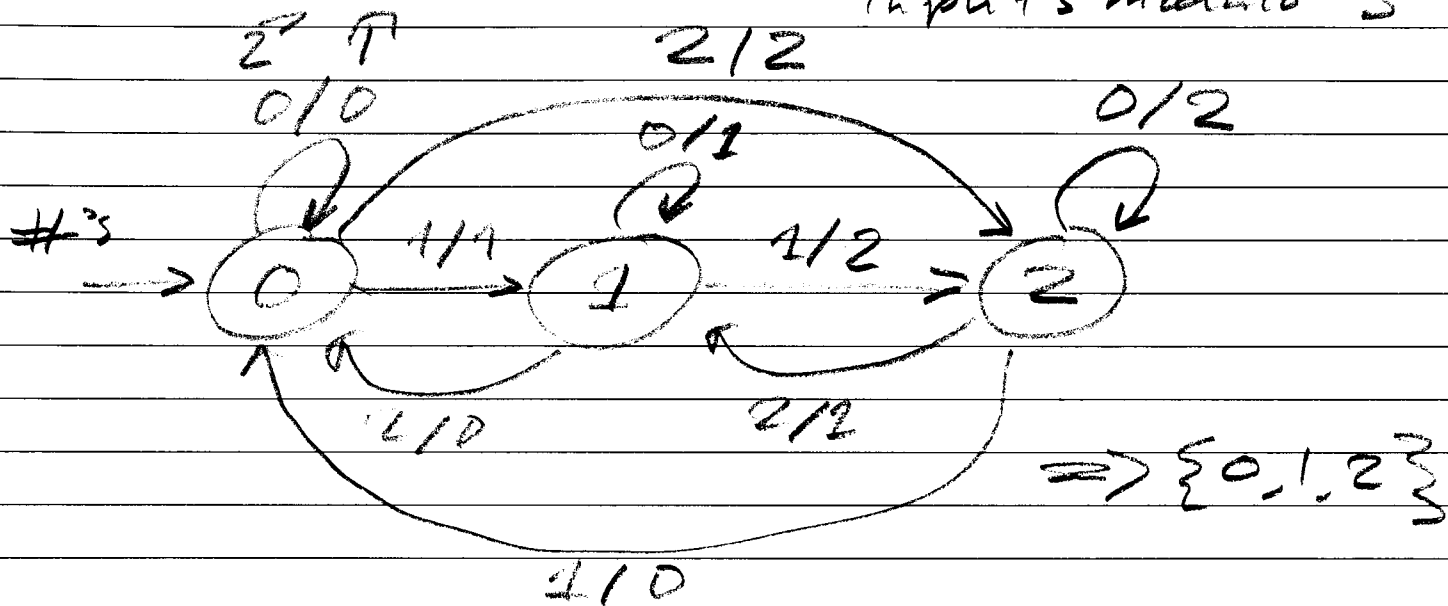
- output depends only on state
- $\delta: Q \times \Sigma \rightarrow Q \times (\gamma: Q \rightarrow T)$

Mealy Machine: $\gamma: Q \times \Sigma \rightarrow T$

- output depends on state AND input

A Simple Mealy "Summing FST"

$\Sigma = \{0, 1, 2\}$, output = sum of all inputs modulo 3



note, a/b on transition : a $\rightarrow$ input symbol
b $\rightarrow$ output symbol

State	input	new state	output
0	0	0	0
	1	1	1
	2	2	2
1	0	1	1
	1	2	2
	2	0	0
2	0	2	2
	1	0	0
	2	1	1

Supser 1.13 - Adding a Reset :

$\Sigma = \{0, 1, 2, \text{reset}\}$

more machine + symbol

Regular Languages:

understand "computation" and relationships between simple languages and finite automata

automaton M accepts language L if:

- when given a string in L , M stops in a state in F
- when given a string not in L , M stops in a state, but not in F

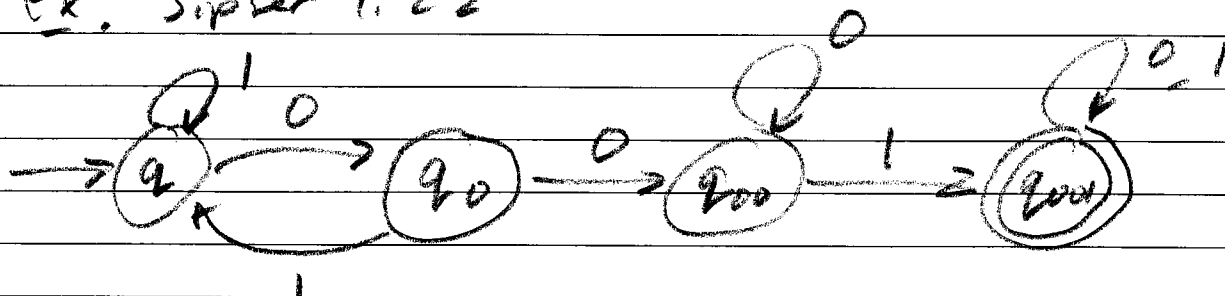
Regular Language: Set of all languages for which (Σ, G) a DFA can be designed as a recognizer

Regular Expressions: notation that allows a concise description of a grammar for any regular language

- any regular language can be expressed as a regular expression

⊛ The language recognized by any DFA is regular, and can be expressed as a regular expression ⊛

Ex. Sipser 1.22



Accepts strings containing 001

⊛ this is a DFA ⊛

- no trap states

Languages as Objects:

Language = Set() which implies languages = object
 • can perform computations over languages

Regular Operations over regular languages

• Assume A, B are languages i.e. sets

$$\text{Union } A \cup B = \{x \mid x \in A \vee x \in B\}$$

$$\text{Concatenation: } A \circ B = \{xy \mid x \in A, y \in B\}$$

$$\text{Kleene Star: } A^* = \{x_1 x_2 \dots x_i \dots x_k \mid k \geq 0, \forall x_i \in A\}$$

A set of objects is closed under some operator if:

- the result of combining any two elements of the set using the operator
- creates a new object that is also in the set

note. $\emptyset, \epsilon$ (empty set) $\in A^*$

$$|A^*| = \infty$$

Properties:

- L is regular iff it is accepted by some FA M_L
- Set of regular languages are closed under
 - union
 - concatenation
 - Kleene star

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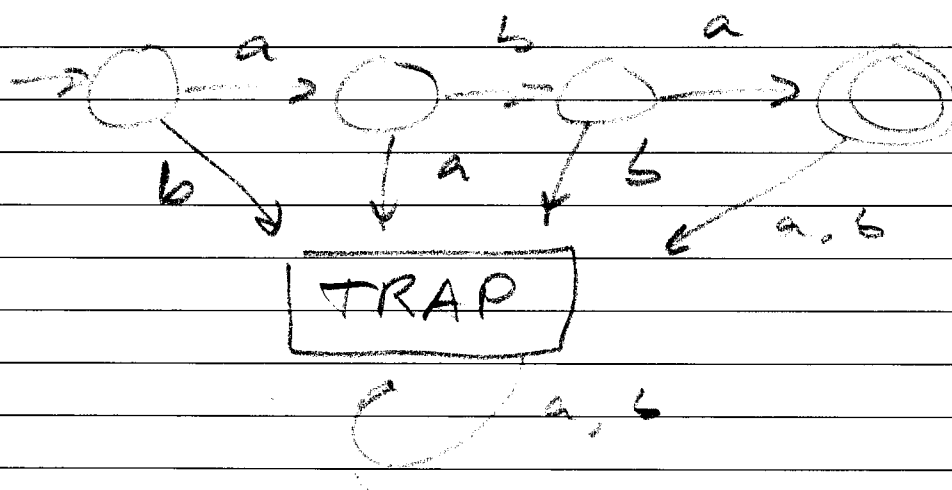
Regular Language Theorem:

Regular expressions are the grammar for RLs

has these rules:

- any specific string $\in \Sigma^*$, $\{\}$, ϵ
- union, concat, or closure on R_1, R_2
st $R_1, R_2 \in RE$

Ex. DFA that accepts $\{aba\}$



I don't need the TRAP state

NFA

Date. 9.16.25
No. 207

Properties of Regular Languages:

- L is regular iff it is accepted by some DFA M_L
- Set of reg langs are closed under
 - Union
 - Concatenation
 - Kleene Star
- How to prove?
 - take any two reg langs A and B
 - from their accepting FAs M_A and M_B
 - construct an FA that accepts the combined language

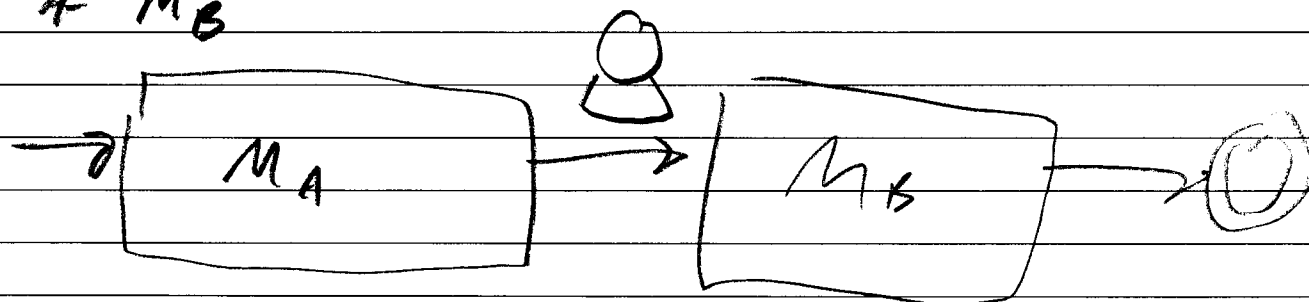
Proof that Union of 2 RLs is RL

- $M_A = (Q_A, \Sigma_A, \delta_A, q_A, F_A)$, $M_B = \dots$
Assume Q_A and Q_B have different names for all states
Assume $\Sigma_A = \Sigma_B = \Sigma$
- Construct $M_{A \cup B} = (Q_{A \cup B}, \Sigma_{A \cup B}, \delta_{A \cup B}, q_{A \cup B}, F_{A \cup B})$
 $Q_{A \cup B} = Q_A \times Q_B$
 $q_{A \cup B} = (q_A, q_B)$
 $F_{A \cup B} = F_A \times F_B$
 $\delta_{A \cup B} = ((q_x, q_y), a) = (\delta_A(q_x, a), \delta_B(q_y, a))$
- Run both machines "in parallel"
- ex. in worksheet

Prove that Concatenation is Closed over Reg Lang:

$$M_A = (Q_A, \Sigma_A, \delta_A, q_A, F_A), M_B = \dots$$

- Assume Q_A and Q_B have different names for all states
- For convenience assume F_A only has one state q_{AF}
- Run M_A first, then M_B
 - intuitively, make the final state(s) of M_A the "same" as the initial states of M_B



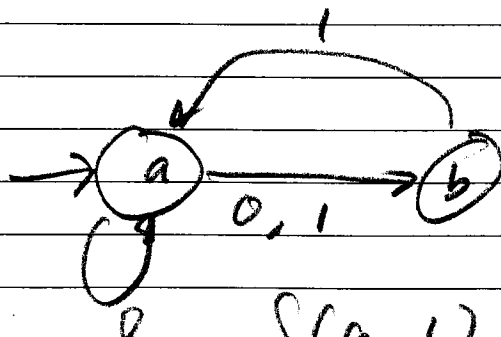
Determinism:

Deterministic FA (DFA): $\delta: Q \times \Sigma \rightarrow Q$

- δ has only one rule for any q, a

Nondeterministic FA (NFA): $\delta: Q \times \Sigma \rightarrow P(Q)$

- multiple choices leaving q for some a



set of ϵ
all subsets of Q
each subset is a possible state

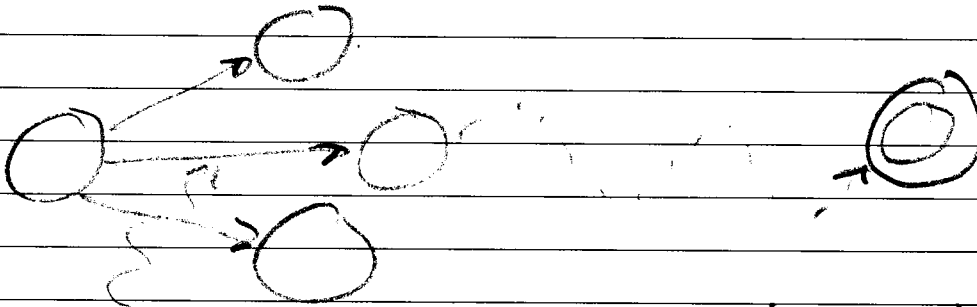
$$\delta(a, 1) = \{b\}$$

$$\delta(a, 0) = \{a, b\}$$

ϵ decision to be made

NFA :

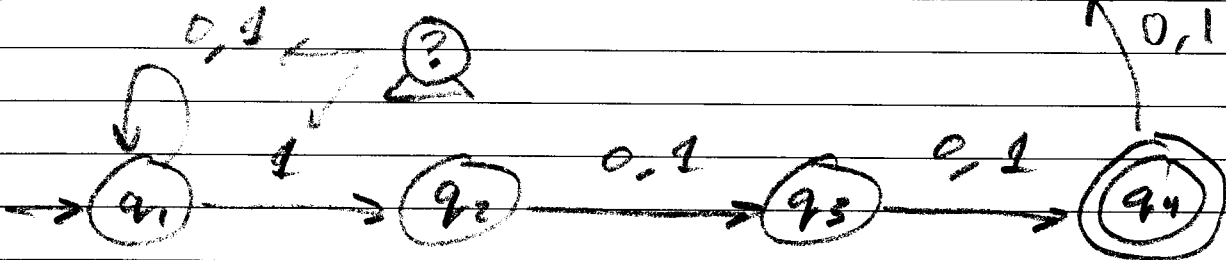
- Assume we have a "choice" of transitions
- Assume also a "crystal ball" to look into the future
 - given inputs we have
 - follow the choices that lead to a final state!



?

a tape must have right length

Ex. Super 1.30



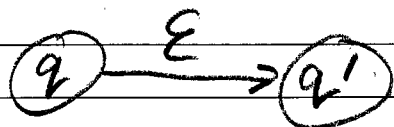
current state	input = 0	input = 1
q1	{q1}	{q1, q2}
...		

when are we 3rd from the end?

* try all possibilities to eliminate ?

NFA Feature: ϵ transition

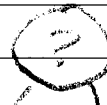
- Assume transitions include $\delta(q, \epsilon) \rightarrow q'$

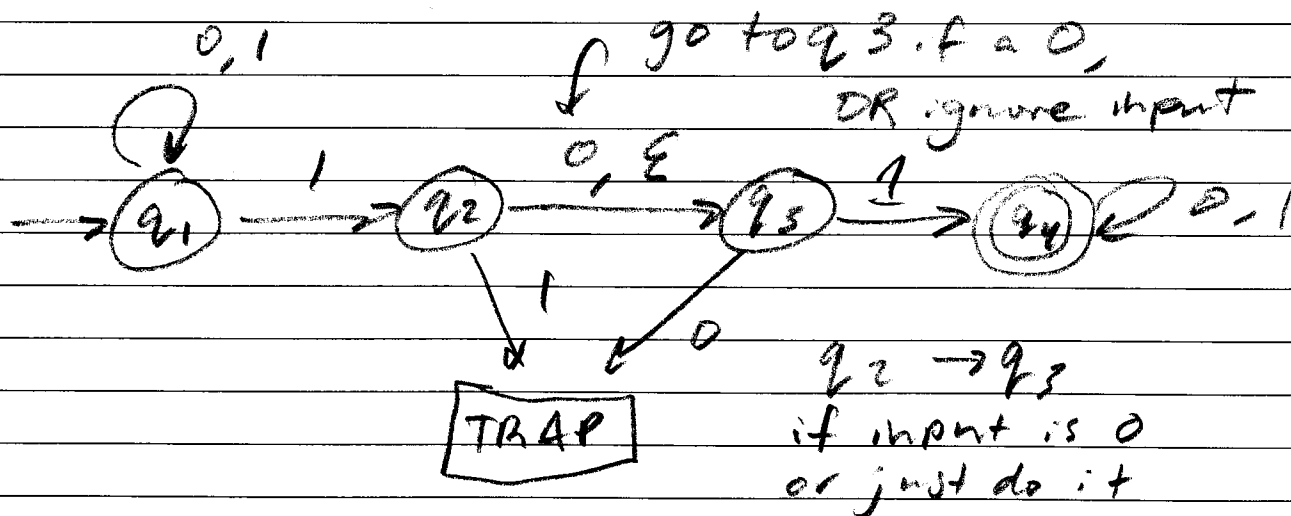


- When moving into state q , NFA can keep moving to state q' without looking at next input
→ leave input for next step

- only one path "non-deterministically"

- Formal Definition: $\delta: Q \times \underbrace{\Sigma}_{\Sigma \text{ or } \epsilon} \rightarrow P(Q)$

note. you do NOT have to take ϵ
all non-deterministic ... decided by 



Regular Expressions

Date. 9.18.25
No. 08

Regular Expressions: Set of strings R with rules:

- Any specific string from Σ^* , or $\{\epsilon\} / \epsilon$
- Union of two regexes $R_1 \cup R_2$
- Concatenation of two regexes $R_1 R_2$
- Kleene Closure of regexes R^*

L is regular iff it can be described as a regex

Shorthand:

- can use "()" to clarify
- R^+ means one or more strings from R
- R^k means k -copies of strings from R

Exs.

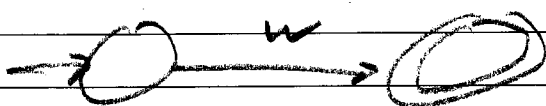
1. $\Sigma^* 001 \Sigma^*$: all strings containing 001
2. $\Sigma^2 \Sigma^2$: strings of length 2
3. $0 \Sigma^* 0 \vee 1 \Sigma^* 1 \vee 0 \vee 1$: start and stop with same 0 or 1

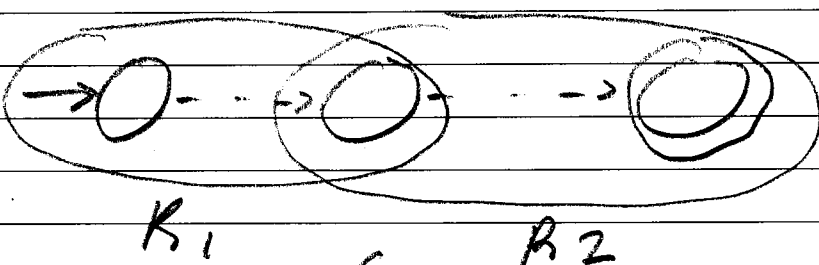
Grep: `grep [options] [patterns] [files]`

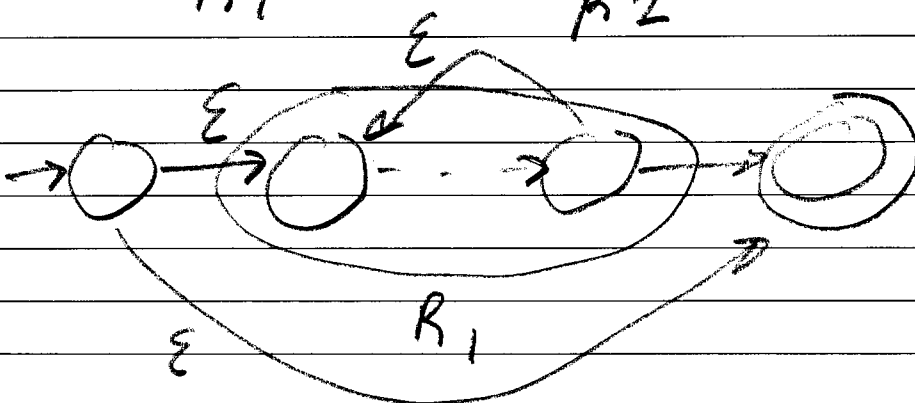
patterns and examples in slides

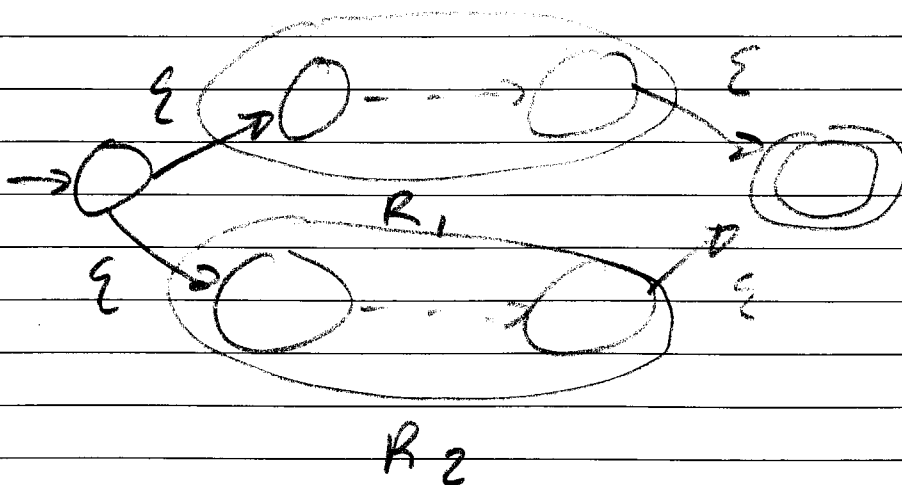
Theorem: Any RE can be converted into an NFA and thus to a DFA and thus is a regular language

Proof by construction: Assume R is a RE

if $R = w, w \in \Sigma^+ \cup \epsilon \rightarrow$ 

if $R = R_1 R_2$ 

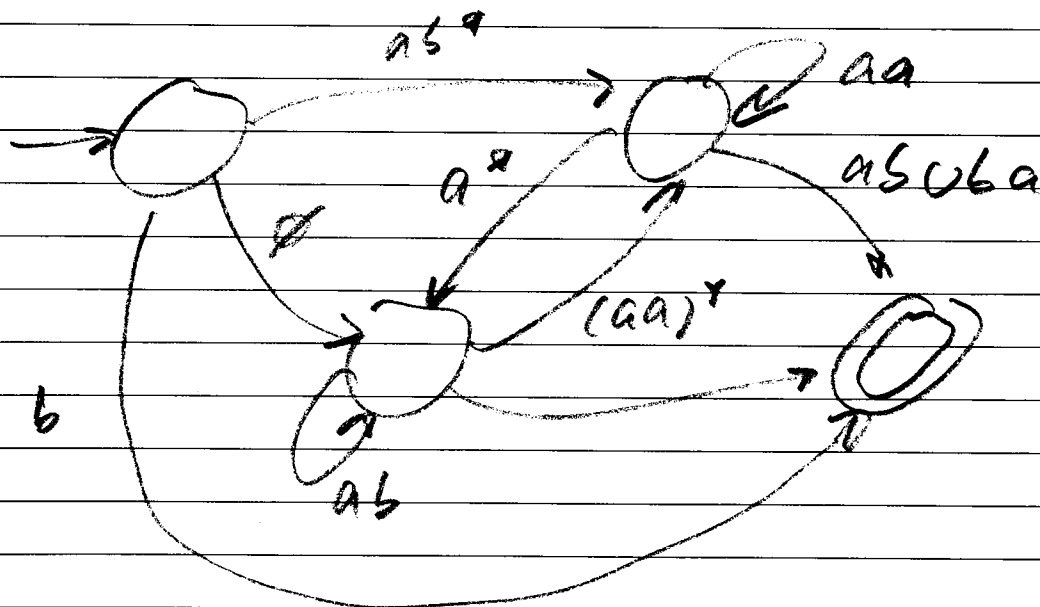
if $R = R_1^*$ 

if $R = R_1 \cup R_2$ 

Closing the Circle: Given a DFA, what is the Regex?

GNFA: generalized NFA

- NFA w/ regexes on edges
- start state has arrows to every other state, but no incoming
- single accept state with arrows from every other state, but no outgoing
- all other states fully connected

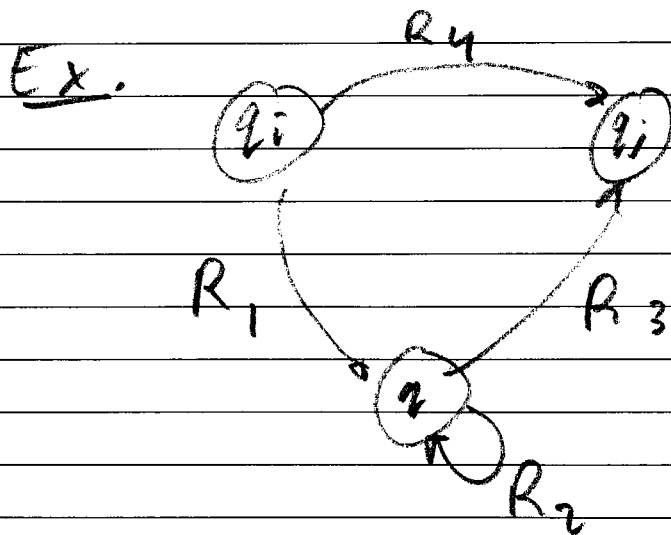


DFA to GNFA:

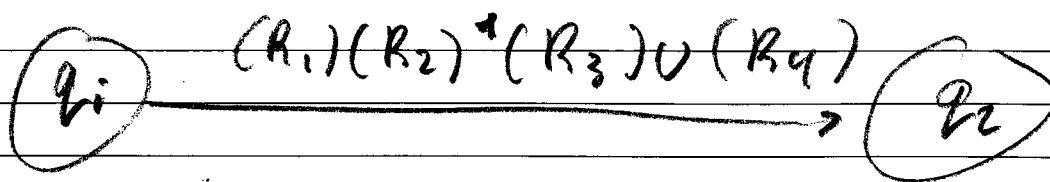
- Add new start state
→ ϵ to old start state
- Add new final state
→ ϵ from old final states
- If multiple arcs b/w any two states
→ replace with single arc with " $\cup$ " of edges
- B/w any states w/o arc
→ add edge with $\emptyset$ label

GNFA to Regex:

1. Initial GNFA has k states, $k \geq 2$
→ each edge labeled w/ regex R_{ij}
2. Pick some state q to be removed
3. Concatenate regexes between edges going in and out of q
4. Add in Kleene star for any closed loop
5. $\cup$ any arcs between same states
6. Repeat until only 2 states
→ arc b/w states is regex

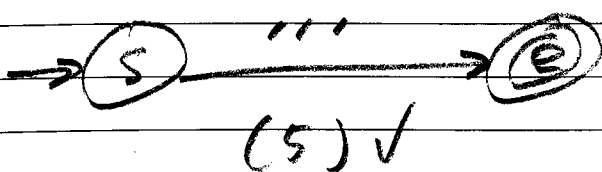
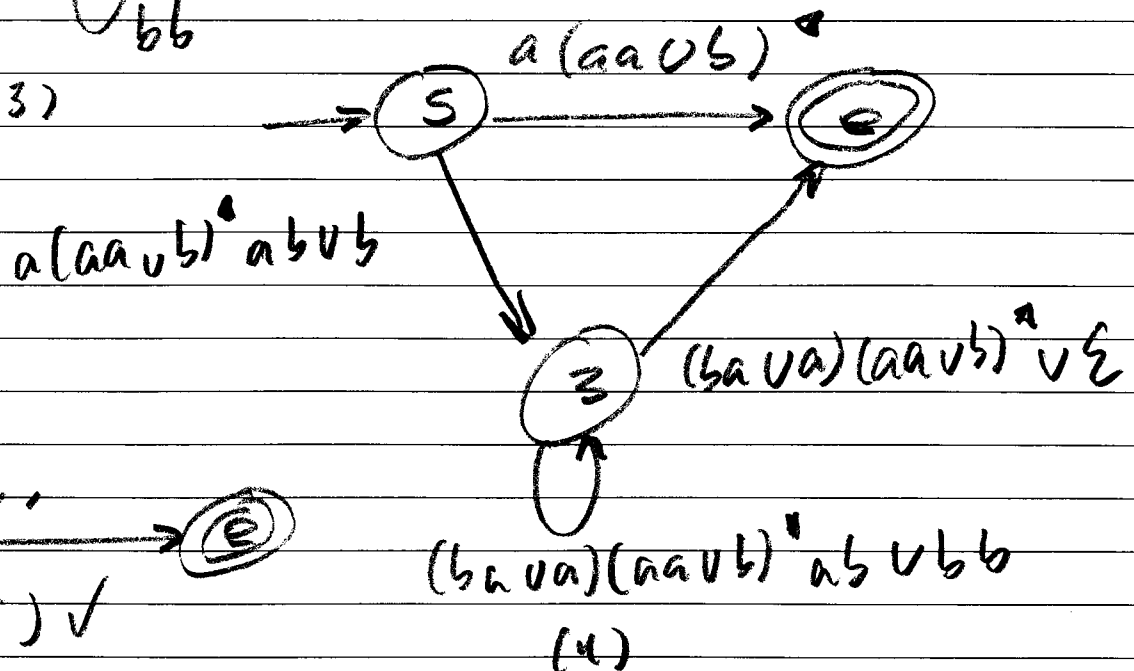
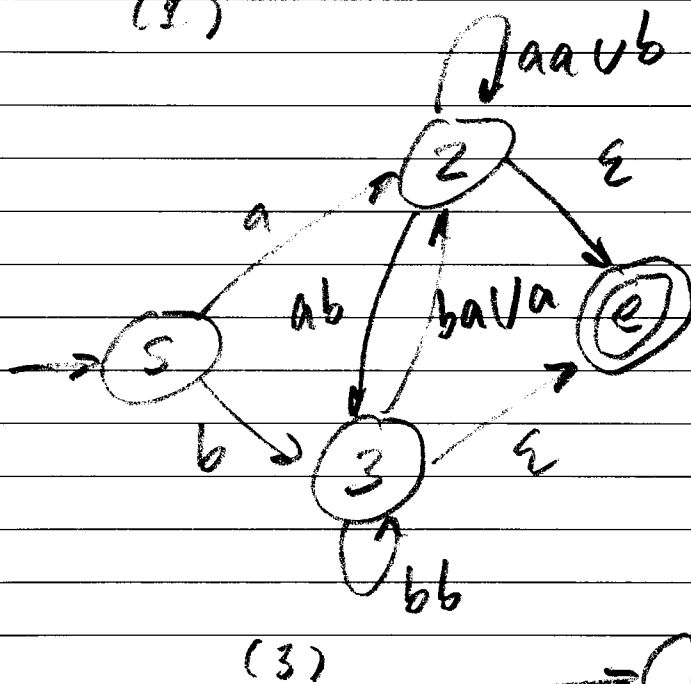
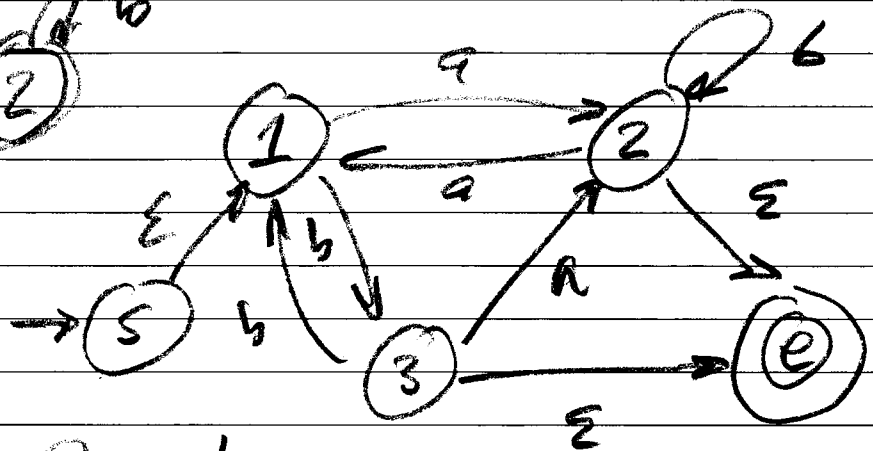
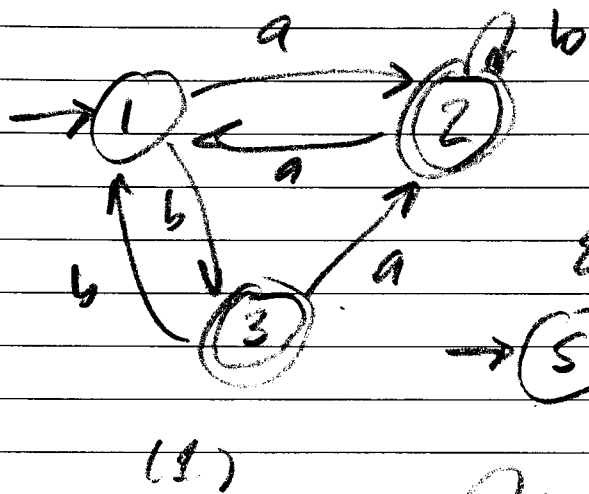


before



after

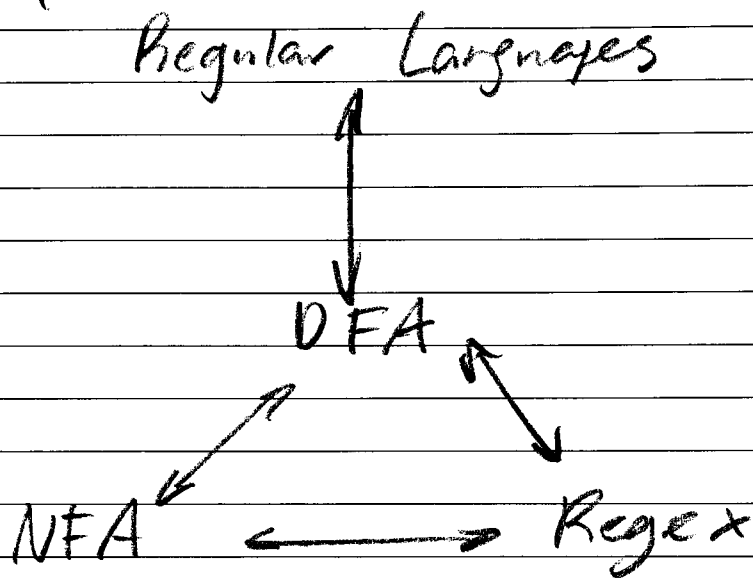
Sipser 1.67 DFA to Regex: steps



Date. _____

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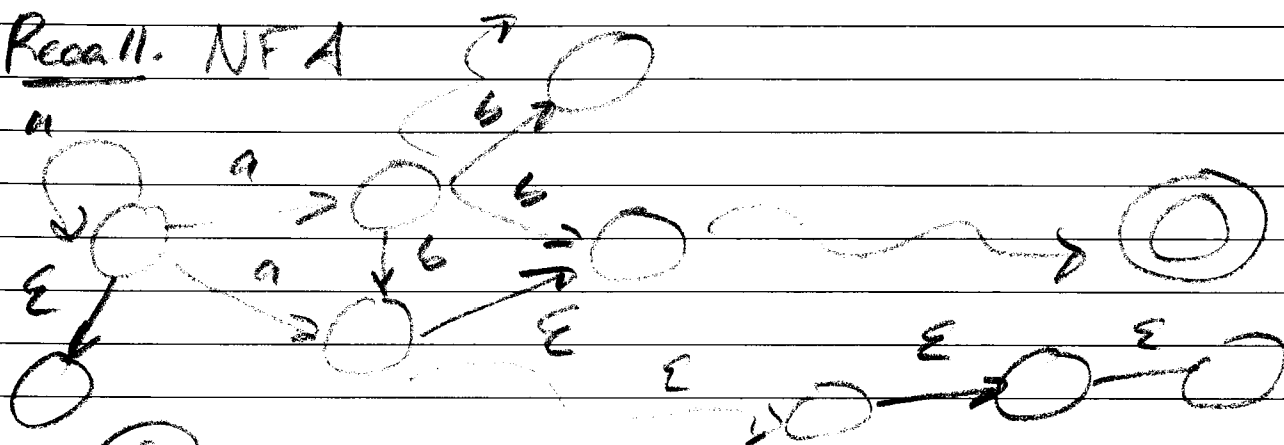
Summary :



NFA to DFA

Date. 9.23.25
No. 09

Recall. NFA



? picks the path that gets to a final state!

ϵ is a "free" transition you can take or not take after any transition

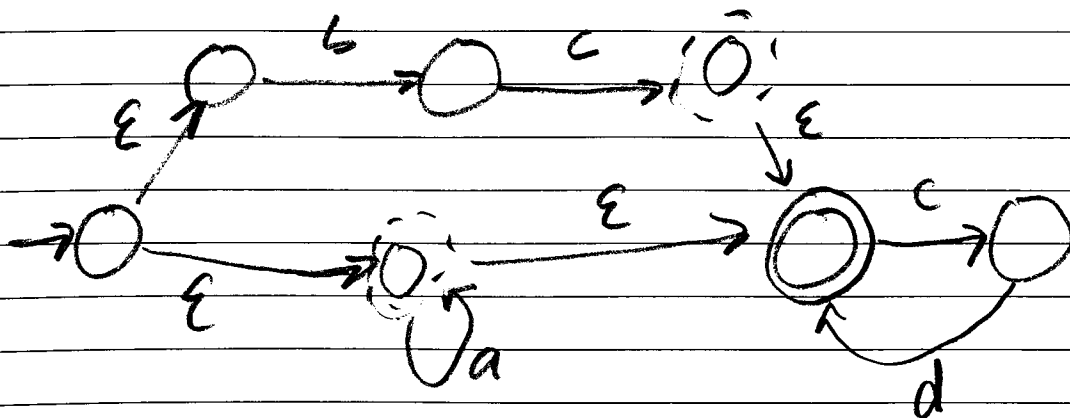
i.e. keep-going option

$$\delta(q_0, c) = \{q_1, q_2, q_3, \dots\}$$

non-deterministic outcome

Goal! NFAs are no more powerful than DFAs, just are easier to design

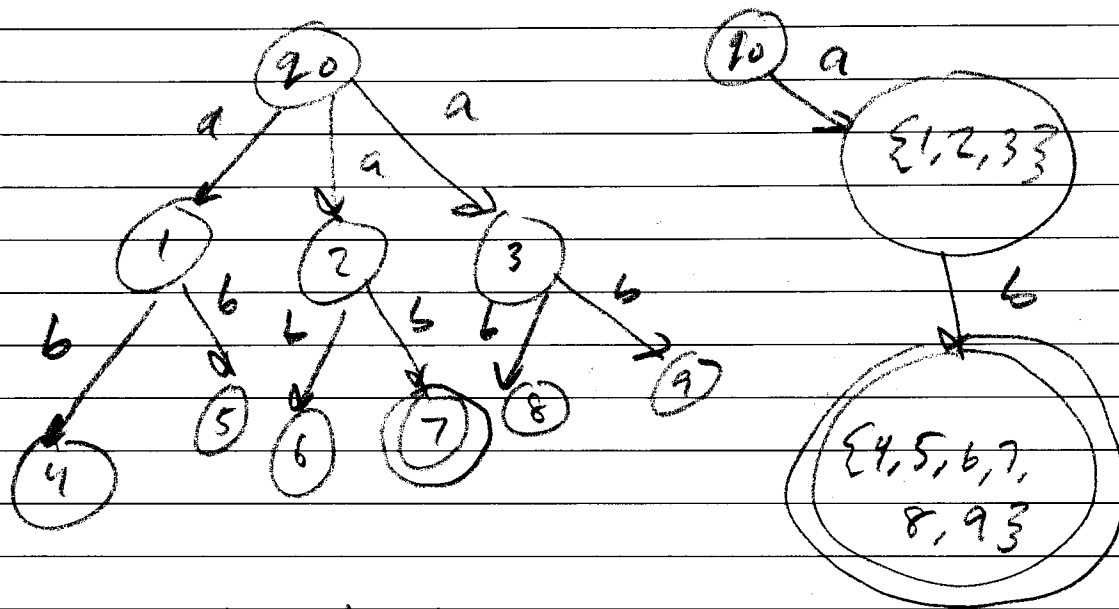
Ex. Regex to NFA, $R = (bc \cup a^+)(cd)^*$



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General Idea :



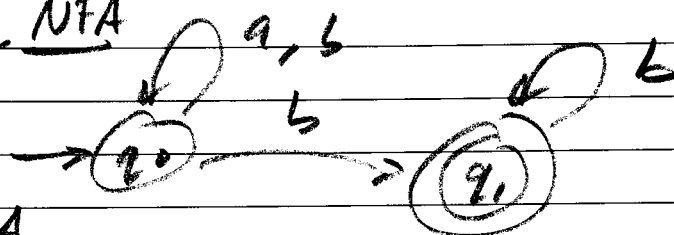
Theorem. Any NFA can be converted to a DFA

NFA: $(Q, \Sigma, \delta, q_0, F)$

DFA: $(Q', \Sigma, \delta', q_0', F')$

- $Q' = P(Q)$ power set
- $q_0' = \{q_0\}$
- $\delta'(q', a) = \{q \mid \delta(q'', a) = q\}$
a single state in the DFA
for some $q'' \in q'$
- $F' = \{q' \mid q' \in Q' \text{ and } \text{some member of } F \text{ is in } q'\}$

Ex. NFA



NFA

$$Q = \{q_0, q_1\}$$

$$\Sigma = \{a, b\}$$

$$L = (a+b)^*$$

DFA

$$Q' = \{\emptyset, \{q_0\}, \{q_1\}, \{q_0, q_1\}\}$$

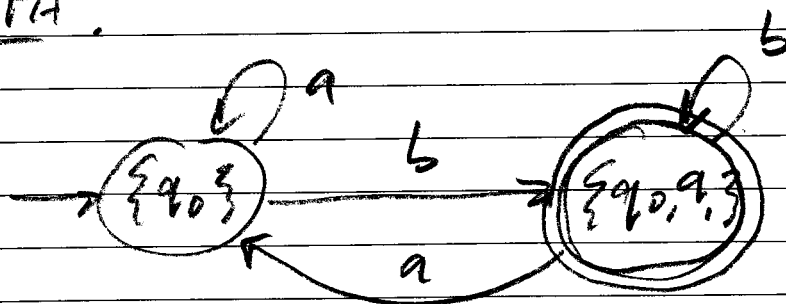
$$q_0' = \{q_0\}$$

$$F' = \text{states with } q_1 = \{\{q_1\}, \{q_0, q_1\}\}$$

δ'

State	Char	New State
$\{q_0\}$	a	$\{q_0\}$
$\{q_1\}$	b	$\{q_0, q_1\}$
$\{q_0, q_1\}$	a	$\{q_0\}$
$\{q_0, q_1\}$	b	$\{q_0, q_1\}$

DFA



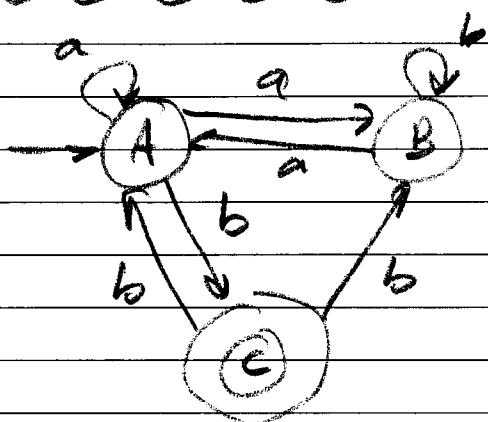
Dealing with ϵ in NFAs:

- Assume transitions include $\delta(q, \epsilon) \rightarrow q'$
- $E(q) = \{q, \dots\}$
 $\subset$ represents all ϵ transitions off of q

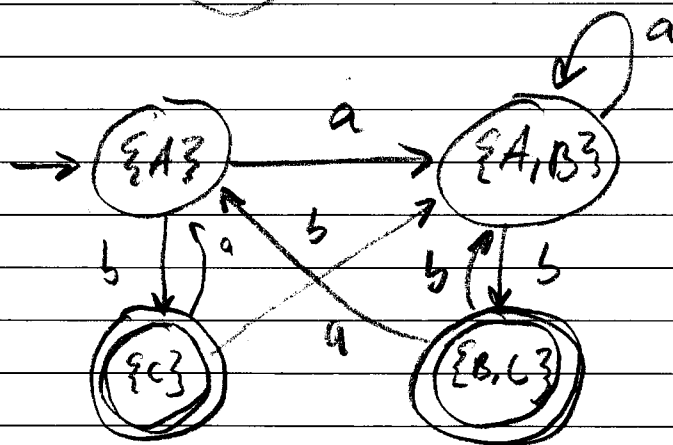
4 more on slides

NFA to DFA Ex.

δ for DFA:



State	a	b
$\{A\}$	$\{A, B\}$	$\{C\}$
$\{A, B\}$	$\{A, B\}$	$\{B, C\}$
$\{C\}$	TRAP	$\{A, B\}$
$\{B, C\}$	$\{A\}$	$\{A, B\}$

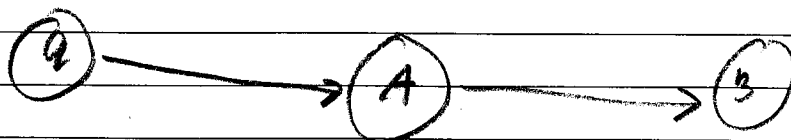


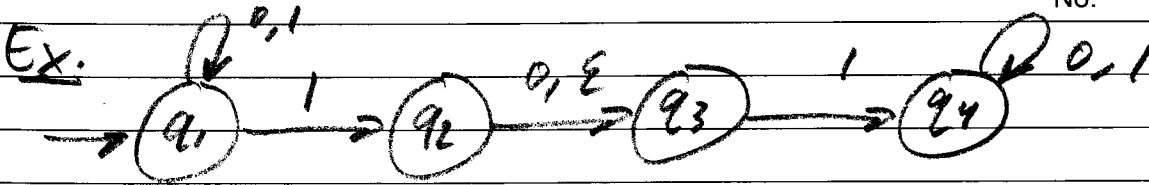
NFA to DFA with ϵ

- Assume transition includes $\delta(q, \epsilon) \rightarrow q'$
- When moving into a state q , NFA can keep moving to state q' without looking at next input

$$\epsilon(q) = \{ \text{reachable by } \epsilon \text{ if I enter by } q \}$$

$\uparrow$
q state in NFA





Epsilon readable states:

$$E(q_1) = q_1$$

$$E(q_2) = \{q_2, q_3\}$$

$$E(q_3) = q_4$$

$$E(q_4) = q_4$$

$$\therefore E(q_1) = \{E(q_1), E(q_2)\}$$

State

$$\{q_1\}$$

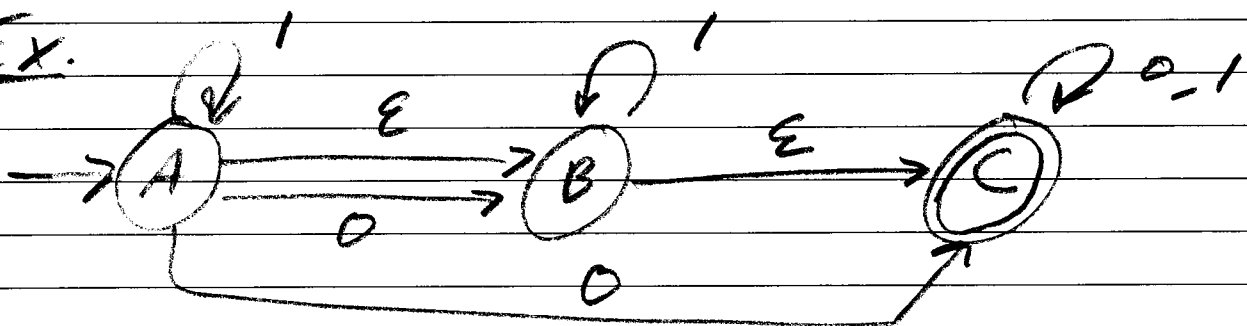
...

$$\begin{array}{c} 0 \\ \hline \{q_1, q_3\} \end{array}$$

1

$$\{q_1, q_2, q_3\}$$

Ex.



$$E(A) = \{A, B, C\}$$

$$E(B) = \{B, C\}$$

$$E(C) = \{C\}$$

State

$$\{A, B, C\}$$

$$\{B, C\}$$

$$\{C\}$$

$$\begin{array}{c} 0 \\ \hline \{B, C\} \end{array}$$

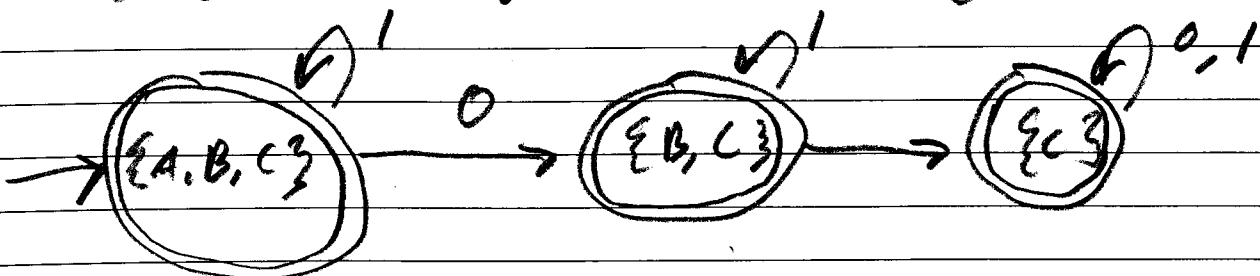
$$\{C\}$$

$$\{C\}$$

$$\begin{array}{c} 1 \\ \hline \{A, B, C\} \end{array}$$

$$\{B, C\}$$

$$\{C\}$$



The Pumping Lemma

Regular Languages:

Language: Alphabet + Grammar

Regular Language:

- describable by a regex (its grammar)
- decidable by a NFA/DFA

Grammar Rules:

- finite # of symbols
- union, concatenation, or Kleene closure of 2 regular languages

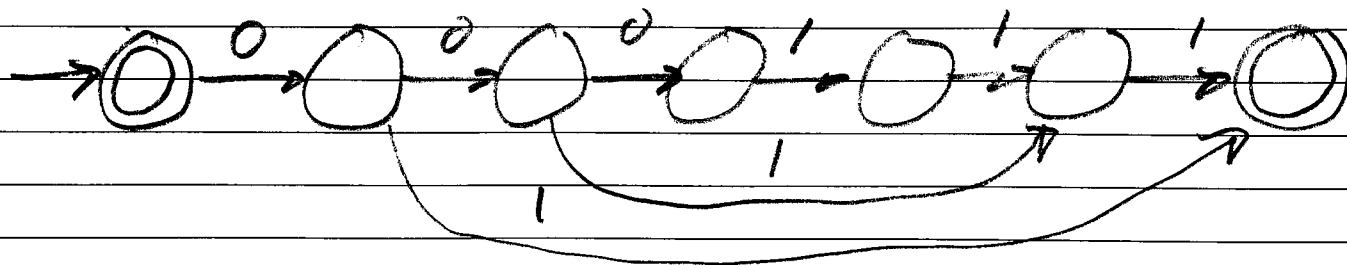
Exs.

- $\{011^n \mid n \geq 0\}$
- $\{0^n 1^m \mid n \geq 0, m \geq 0\}$
- $\{0^k 1^k \mid 0 \leq k \leq n, \text{ for some fixed } n\}$
- $\{w \mid w \text{ has equal \# of 01 and 10 substrings}\}$

Non Ex.

- $\{0^n 1^n \mid \forall n \geq 0\}$

Let's Implement $\{0^k 1^k \mid 0 \leq k \leq n = 3\}$
 $= \{\epsilon, 01, 0011, 000111\}$



7 states

How many states for arbitrary n ? $2n + 1$
(fixed)

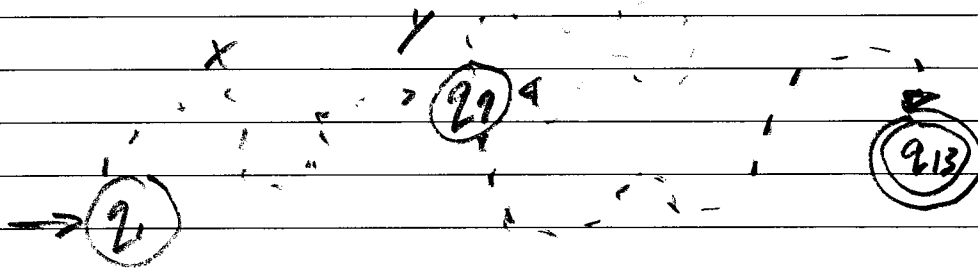
The Limits of Regular Languages:

- DFAs can only "count" up to their number of states
→ no "memory" or "registers"
- There are languages that require "counting" arbitrarily
→ cannot be accepted by DFA/NFA
→ cannot be regular

Exs.

- $\{w \mid w \text{ has } n \text{ a's and } n \text{ b's, } n \text{ arbitrary}\}$
- $\{a^n b^n \mid n \geq 0\}$

"Pumping" in Regular Languages:



- string xy^kz follows dashed path, thus in L
- substring y loops around $q2$
- Thus any string of form xy^kz $\forall k$ is in L

ie we have pumped substring y

- $k > 0 \Rightarrow$ "pump up"
- $k = 0 \Rightarrow$ "pump down"

The Pumping Lemma:

if language A is regular, then there is a number p (called pumping length), where:

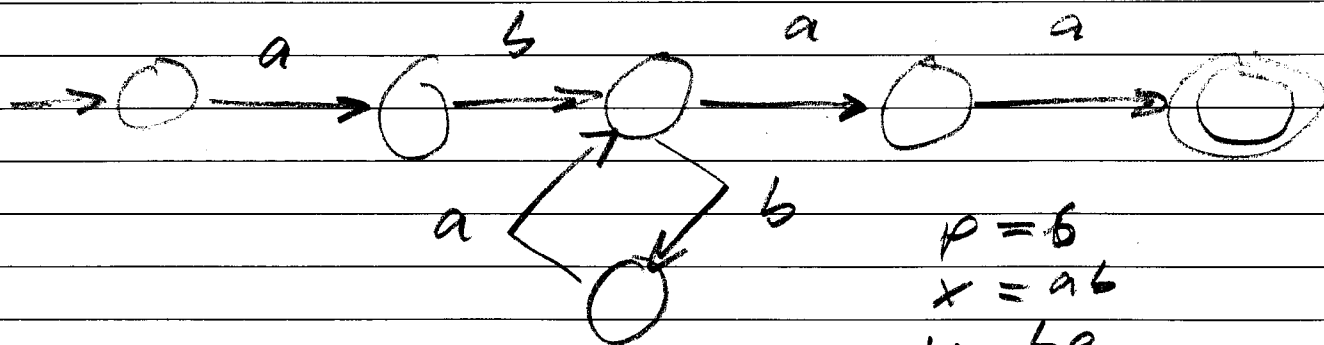
$\forall$ strings $s \in A$ s.t. $|s| \geq p$
 $\exists x, y, z$ where

if $s = xyz$, $|y| > 0$, $|xy| \leq p$
then xy^iz must also be in $A \forall i \geq 0$

we say string has been pumped

$p \approx$ number of states in smallest DFA that accepts A

Ex. $ab(ba)^*aa$ regular



$p = 6$
 $x = ab$
 $y = ba$
 $z = aa$

Showing Some Language B is NOT Regular:

Proof by Contradiction: Assume B is regular

• Find a string that is in B and show it cannot be pumped

→ look at all ways to divide string up

→ Show that pumping each of them is not in B

• Conclusion: assumption must be FALSE

→ B not regular

Ex. 1.73: $B = \{0^n 1^n \mid n \geq 0\}$

Assume B is regular with pumping length p

$$|0^p 1^p| \geq 2p$$

$0^p 1^p$ is in B and has length $> p$, so choose it as s

- Since $|xy|$ must be $\leq p$, and also it must be that $1 \leq |y| \leq p$
- you can only be some number of 0s (1 or more)

using pump up: $xy^i z = 0^{p+(i-1)k} 1^p$ not in B
we added 0s but not 1s

using pump down: $xy^i z = 0^{p-k} 1^p$ not in B

since both not in B by contradiction it's not regular

Ex 1.74: $C = \{w \mid w \text{ has same \# of 0s and 1s}\}$

- Assume C is regular with pumping length p
is any string $> p$ must have a loop
- $0^p 1^p \in C$ and has length $> p$, so choose it as s
note, theorem works for any string $> p$
- ...

4 more exs worked out in slides

Date. 10.2.25
No. 12

Pumping Lemma cont.

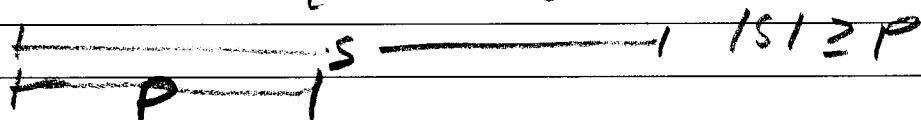
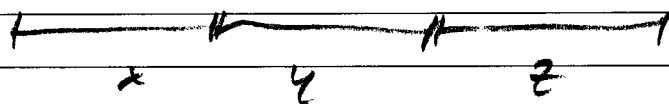
How to show L is not Regular?

Proof by Contradiction.

1. Assume L is Regular

$\forall s \in L$ st $|s| \geq p$ must be pumpable

Pick one s st s divisible into $x y z$

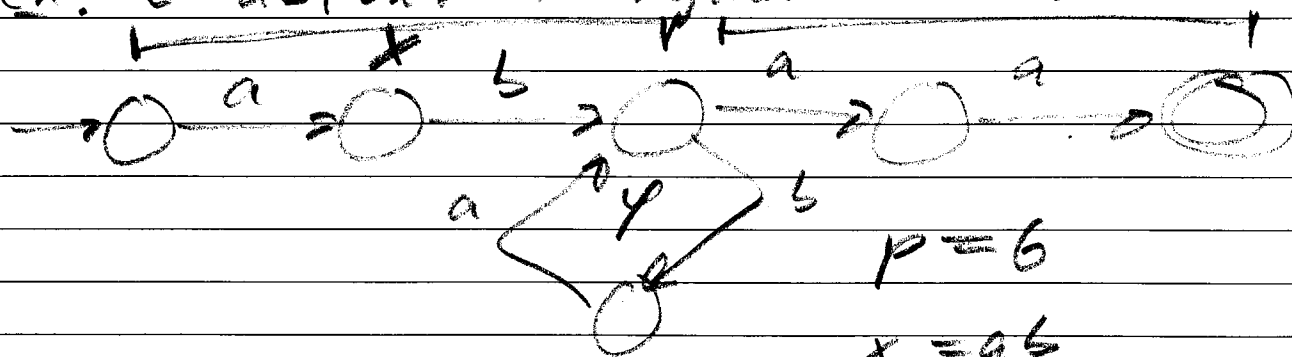


Pivot process, show no partition exists:

show $\nexists x y^i z \in L$

$|xy| \leq p, |y| \geq 1$

Ex. $L = a^i (ba)^j a^k$ regular?



$\forall s \in L$ st $|s| \geq p$

$\exists x, y, z$ st $s = xyz$,

$|y| \geq 1, |xy| \leq p$

AND $xy^i z \in L \forall i \geq 0$

Show L is NOT Regular:

1. Assume L is regular
2. Find one string in L and show it can't be pumped

Types of Languages

Context Sensitive Languages
(Turing Machines)

Context Free
Languages (PDAs)

Regular
Languages
(VPAs)

Ex. $E = \{0^i 1^j \mid i > j\}$

Assume E is regular with pumping length P
 $|0^P 1^1| = P$ so choose $s = 0^P 1^1$

Therefore xy must be all 0s since $|xy| \leq P$
 Therefore y must be all 0s, since $|y| \geq 1$

Now Pump down: try xy^0z

This removes at least 1 0 from the string

Now only have P 0s, and i NOT $> j$ anymore

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Context Free Grammars :

- Collection of substitution rules of form

$$\textcircled{A} \rightarrow w_1 w_2 \dots w_n$$

↑

concatenation of strings

- LHS: a variable / nonterminal
→ name of a subset of strings relevant to the languages

- RHS: strings of either
→ symbols (aka terminals) from Σ (alphabet)
→ or nonterminals

- Start Variable: nonterminal representing any string in the language

A interpretation: LHS is a set of strings using RHS

Formal CFG : (V, Σ, R, S)

V = set of nonterminals (vocabulary)

Σ = alphabet

R = set of rules

S = start nonterminal

Ex, $V = \{A, B\}$

$\Sigma = \{0, 1, \# \}$

Start nonterminal = A

Rules :

$A \rightarrow 0A1$

$A \rightarrow B$

$B \rightarrow \#$

$B = \{ \# \}$

$A = \{ 0^n \# 1, 0^n \# 11, \dots \}$
recursive!

Push Down Automatas

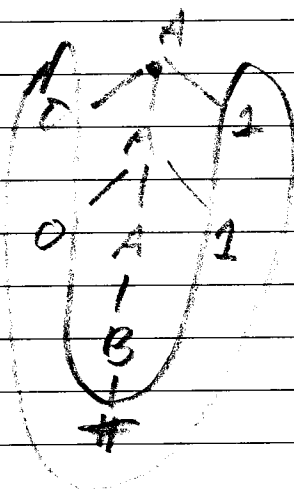
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Notation.

$A \rightarrow bc$ can become $A \rightarrow bc \mid ad$
 $A \rightarrow ad$ OR

Parsing:

ex. 00#11 from last ex
can use a Parse Tree:



The leaves of the parse tree gives a string accepted by the language

Derivation: sequence from a variable to a string

Assume u, v, w are strings of terminals & nonterminals.

• uAv yields uwv (written $uAv \Rightarrow uwv$) if there is a rule $A \rightarrow w$ from the grammar

• u derives v (written $u \xRightarrow{*} v$) if either $u = v$

or $u \Rightarrow u_1 \Rightarrow u_2 \Rightarrow \dots \Rightarrow u_k$ and $u_k = v$ for $k \geq 0$

ex. $A \Rightarrow 0A1 \Rightarrow 00A11 \Rightarrow 000A111 \Rightarrow 000B111 \Rightarrow 000\#111$

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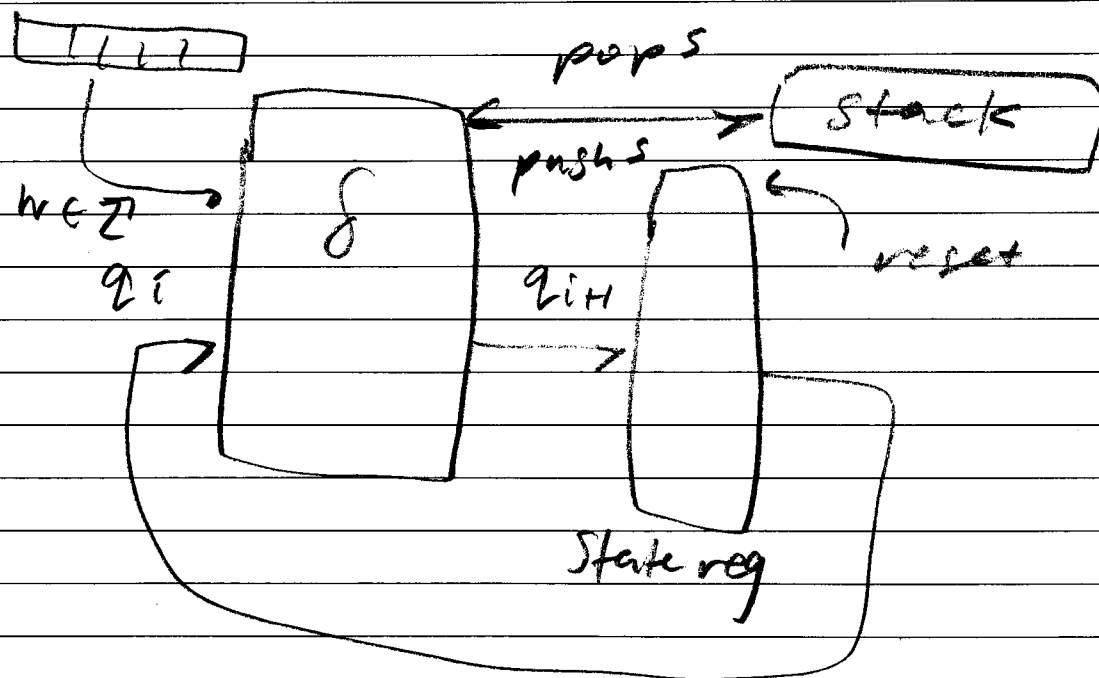
note, leftmost derivation first (convention)

→ solves nondeterminism in CFGs

i.e. it's possible to have 2 valid parse tree/derivations for the same string

⚡ Eds of constructing CFGs in slides and worksheet ⚡

Push Down Automata: computing with infinite storage



⚡ assume stack can grow to unbounded depth

6-tuple $(Q, \Sigma, \delta, q_0, F, \Gamma)$

Q : set of states

Σ : set of input symbols

$\delta: Q \times \Sigma \cup \epsilon \times \Gamma \cup \epsilon \rightarrow P(Q \times \Gamma \cup \epsilon)$

q_0 : initial state

F : set of final states

Γ : stack alphabet

power set

$\Sigma \cup \epsilon = \Sigma \cup \epsilon$

$\Gamma \cup \epsilon = \Gamma \cup \epsilon$

Normal PDA Transitions : (no ϵ)

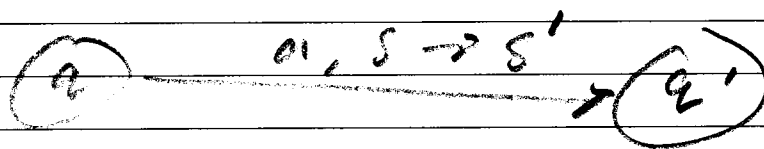
$$\delta: Q \times \Sigma_c \times \Gamma_c \rightarrow P(Q \times \Gamma_c)$$

if in state q , with input w , and top of stack s :

- pop s from stack
- choose one $(q', s') \in \delta$
- change state to q'
- push s' onto stack

note, nondeterminism

multiple identical (a, s) possible



$$a, s \rightarrow s'$$

$$\delta(q, a, s) \rightarrow (q', s')$$

a : tape character

s : current top of stack

s' : new top of stack

Special PDA Transitions: allows us to not touch the stack

if $\delta(q, w, \epsilon)$:

- don't need to match to stack
- don't pop anything from stack

if $\delta(q, \epsilon, s)$: NFA transition

- don't need to match with input
- but match s with top of stack

if $\delta(q, \epsilon, \epsilon)$: DFA transition

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

- if $\delta(q, w, \epsilon)$: stack doesn't matter
- if $\delta(q, \epsilon, s)$: input doesn't matter
- if $\delta(q, \epsilon, \epsilon)$: like NFA

if pair chosen from δ is (q', ϵ) :
just change state not stack

Summary: 4 combinations

① $\delta(q, a, x) \rightarrow (q', y)$

1. a must be input
2. x must be top of the stack
3. pop the x
4. push the y

② $\delta(q, a, x) \rightarrow (q', \epsilon)$
pop x no push

③ $\delta(q, a, \epsilon) \rightarrow (q', y)$
don't pop, push y

④ $\delta(q, \epsilon, \epsilon) \rightarrow (q', \epsilon)$
ignore the stack

8 possibilities with output in mind

⑤ $\delta(q, \epsilon, x) \rightarrow (q', y)$

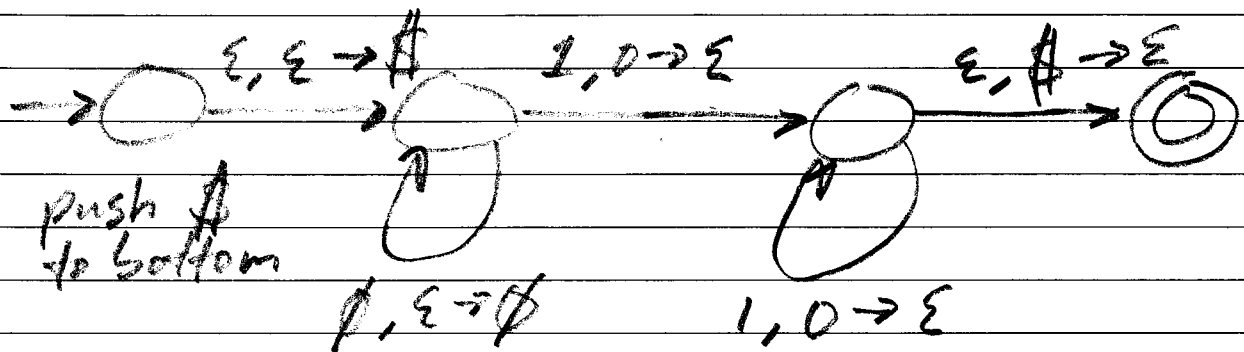
⑥ $\delta(q, \epsilon, x) \rightarrow (q', \epsilon)$

⑦ $\delta(q, \epsilon, \epsilon) \rightarrow (q', y)$

⑧ $\delta(q, \epsilon, \epsilon) \rightarrow (q', \epsilon)$

Ex. $L = \{0^n 1^n \mid n \geq 0\}$ is NOT regular

Build a PDA to accept it:

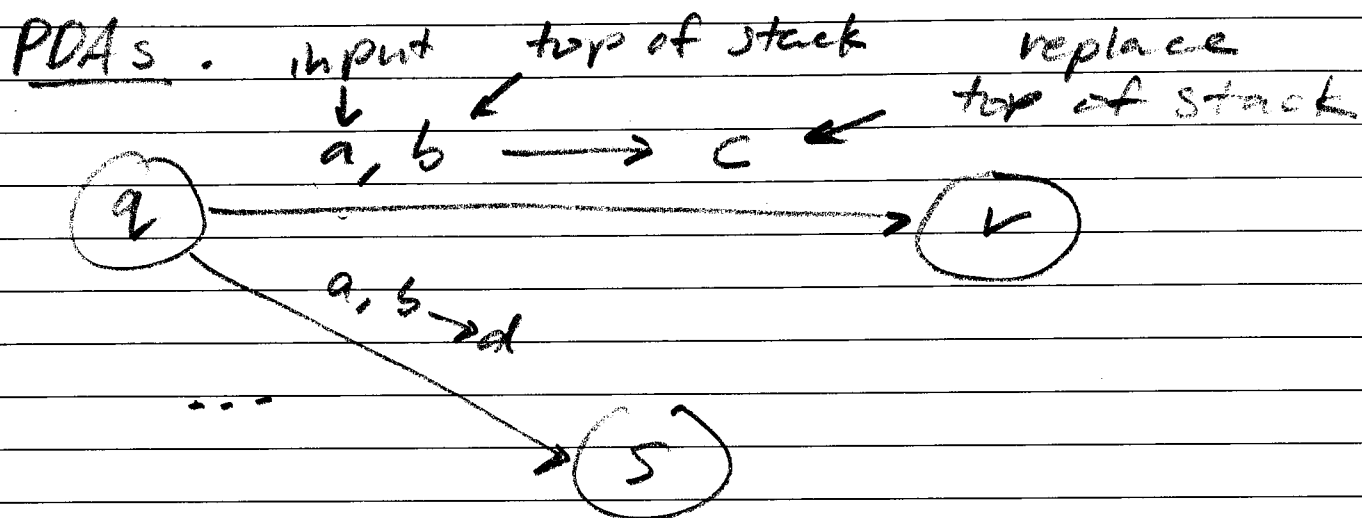


A most PDA's follow this structure & is - with the \$

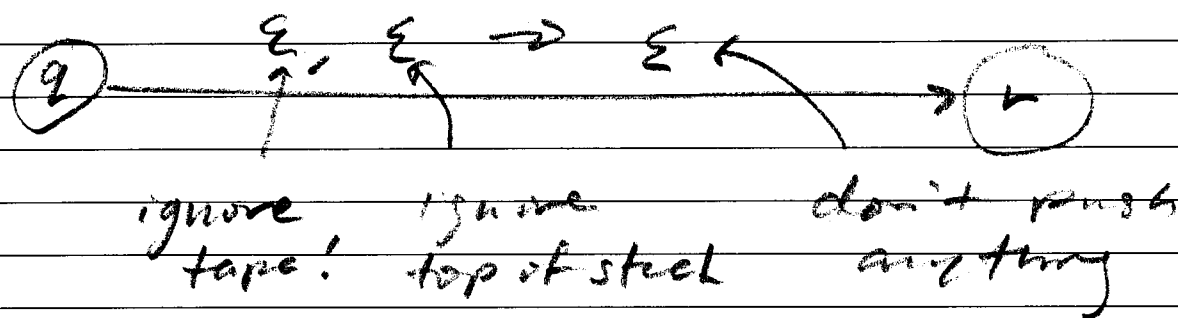
note. this doesn't work for $0^N 1^N 2^N$!

note. input, stack_pop $\rightarrow$ stack_push

GFG to PDA cont



can be nondeterministic!



Ex. design a PDA to accept:

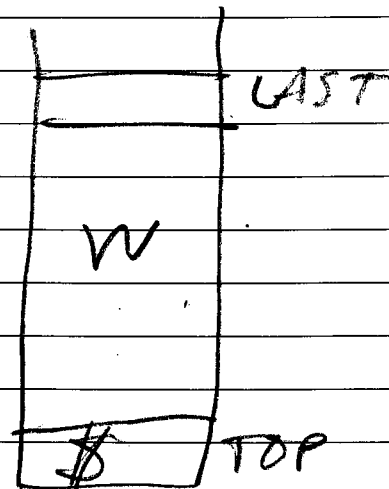
$\{ w \# w^R \mid w \in \{a, b\}^* \text{ and } w^R \text{ is reverse of } w \}$

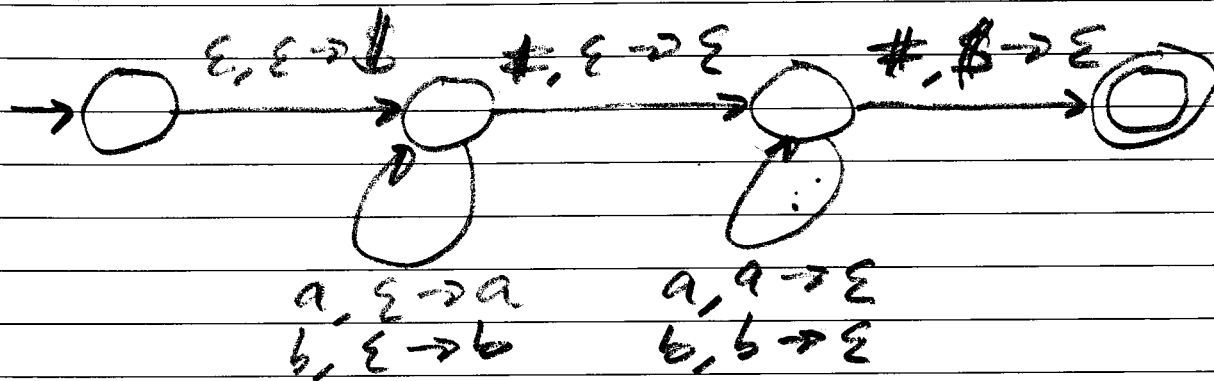
strategy:

1. push tape to stack until #
2. pop while tape is top of stack and then pop top of stack

0. push # to stack

3. if at end of tape we see # on TDS, DONE



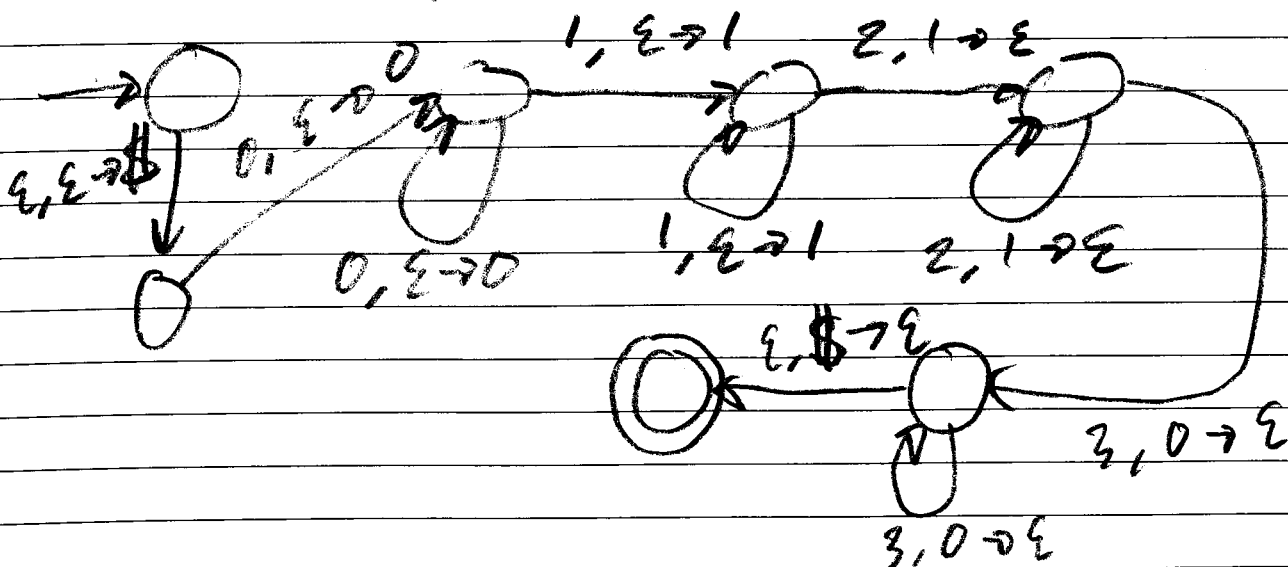
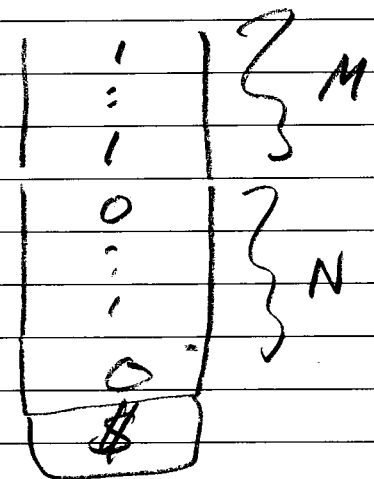


Design a PDA for language L :

$$L = \{0^n 1^m 2^m 3^n \mid n \geq 1, m \geq 1\}$$

Strategy:

- push $\#$ to stack
- push 0s to stack
- push 1s to stack
- if a 2 comes with a 1 on the stack, pop the stack
- if a 3 comes with a 0 on the stack, pop the stack



Are there Limits to PDA's?

consider $L = \{a^i b^j c^k \mid i \neq k\}$

if k is fixed, consider NFA^k at most $3k+1$ states.

yes! can't watch these using one stack
it, can't remember arbitrary n twice

Lemma 2.21: Every CFL decidable by some PDA

Proof by construction: Build PDA from CFG.

- keep next expected symbol on top of stack
- i.e. the terminal or nonterminal

• if expect tunnel, $T \rightarrow S$ is true also

- it expect non-terminal, non-terminating
- select correct rule

- replace top of stack by rule's RHS

Ex. $A = OAI$ $000 \neq III$

 $A \rightarrow B$

民 → 本

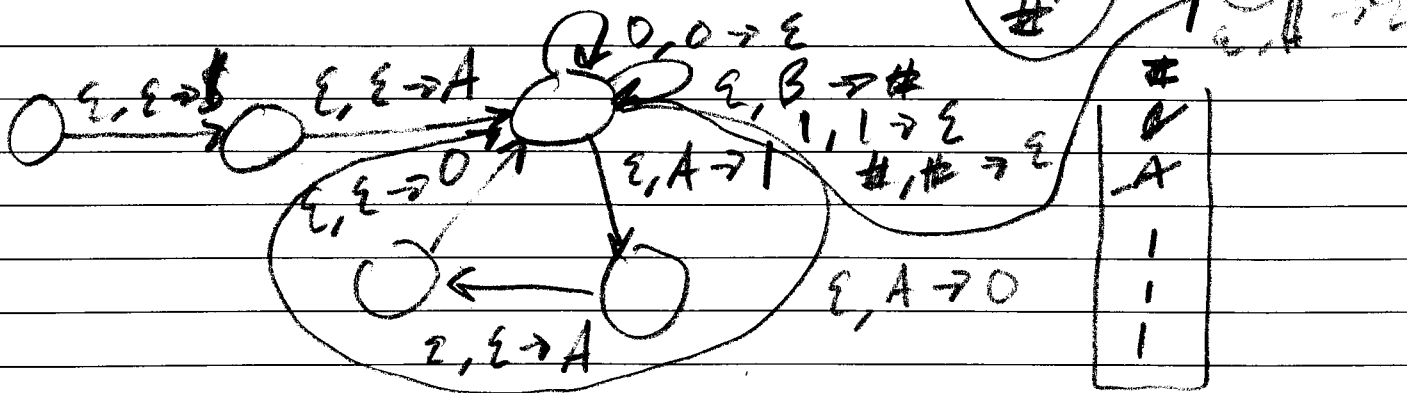
$$\mathbb{Z} = \{0, 1, \dots\}$$
$$V = A, B$$

Strategy:

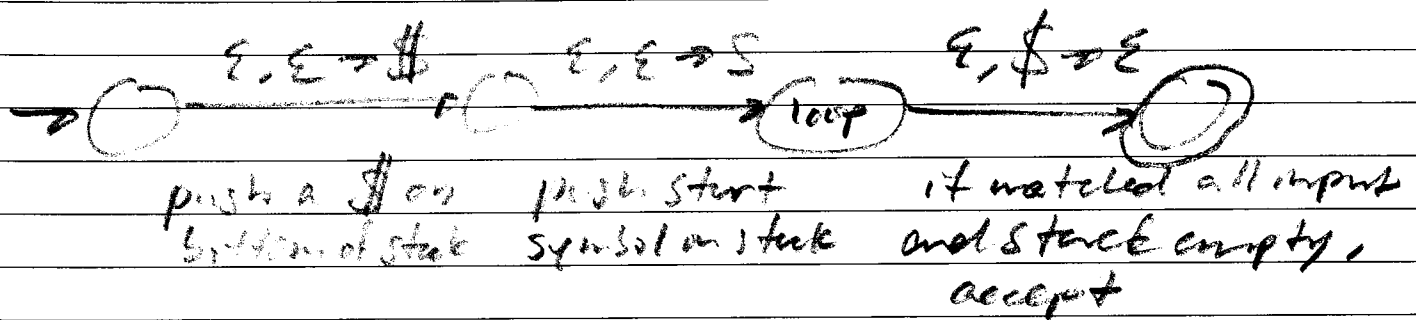
• push

- push start

- if nonterminal choose right rule and push to stack



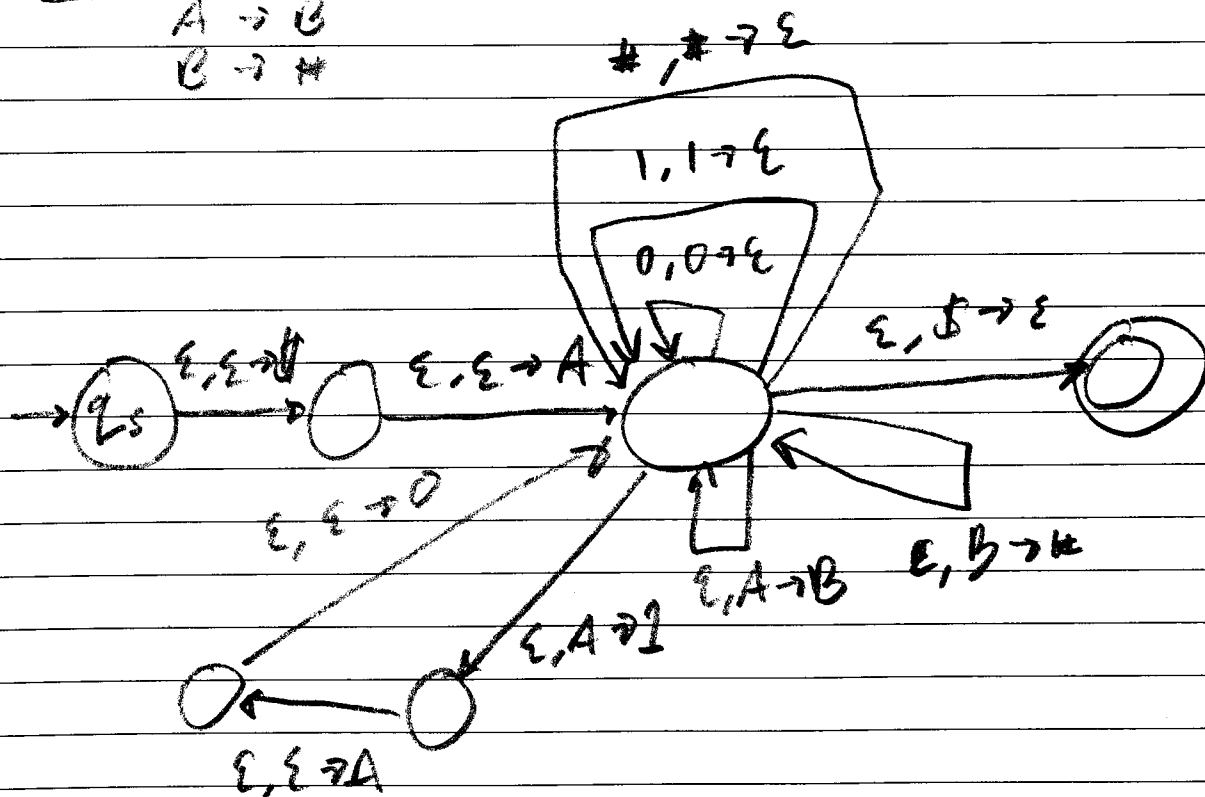
Basic CFG $\rightarrow$ PDA Structure :



Now add two types of loops around q_{loop} :

1. Loops that match a terminal from Σ'
2. Loops that replace a nonterminal like A by one of the rules $A \rightarrow wxy$

Ex. $A \rightarrow 0A1$
 $A \rightarrow B$
 $B \rightarrow \#$



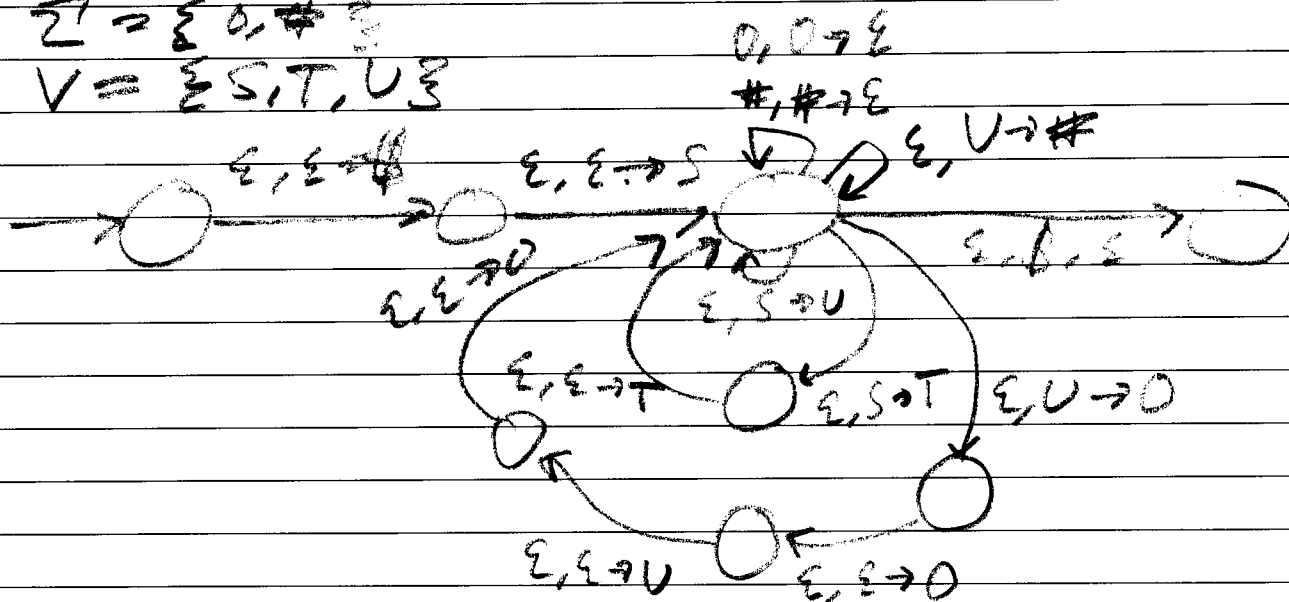
Date. 10.30.25 Pumping Lemma for CFLs
No. 18

Ex. Design a PDA for

$S \rightarrow TT / U$
 $T \rightarrow OT / T0 / \#$
 $U \rightarrow OU00 / \#$

$\Sigma = \{0, \#\}$

$V = \{S, T, U\}$



Convert CFG to CNF:

Ex. Convert $S \rightarrow AaBb$, $A \rightarrow aB$, $A \rightarrow B$,
 $B \rightarrow b$, $B \rightarrow c$, S the start symbol

$A \rightarrow b$	$S \rightarrow AA_1$	$A \rightarrow U_1 B$
$A \rightarrow c$	$A_1 \rightarrow aA_2$	$A_1 \rightarrow U_1 A_2$
$U_1 \rightarrow a$	$A_2 \rightarrow Bb$	$A_2 \rightarrow BU_2$
$U_2 \rightarrow b$		

All rules of this in worksheet 4

END of exam 2 material

Are there limits to PDAs?

Consider input $a^k b^k c^k$ for some k
 if k is fixed, we can build a PDA with
 at most $3k+1$ states

but if k is arbitrary? the stack can't
 remember an arbitrary k twice.

Recall.

every CFL generated by CFG

every CFG has a PDA that recognizes it

given a string in a CFL, it can be reduced to
 its CFG

every PDA can be mapped to a CFG and
 is equivalent to a CFL

Pumping Lemma for CFL:

if L is a CFL $\exists p$ where

for any string s where $|s| \geq p$

s can be divided into 5 substrings $s = uvxyz$
 where:

$|vy| > 0$ (i.e. either at least v or y not empty)

$|vxy| \leq p$ (ignore leading u and trailing z)

Also that for all $i \geq 0$, $uv^i xy^i z$ is in L

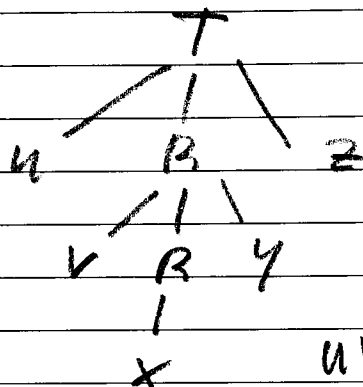
note. u, x, z may be empty strings

Date. _____
No. _____

Consider any CFL L : any string in L can be parsed

Ex.

$T \rightarrow uRz$
 $R \rightarrow vRy$
 $R \rightarrow x$

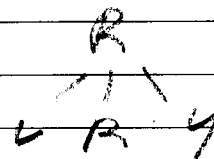


$$|V| = |\{T, R\}| = 2$$

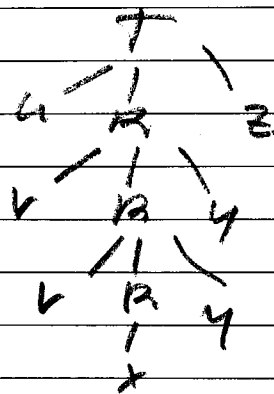
$uvxyz$

Assume depth of parse tree exceeds $|V|$
Thus some nonterminal must be reused

pull $\begin{matrix} R \\ | \\ x \end{matrix}$ out of the tree and add



becomes

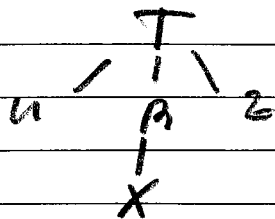


$uvvxyz$

is pumped vRy

can do this again and again $\dots uv^i x y^i z$

Or if we don't iterate R : uxz



Pumping CFL Exs

Date. 11.4.25
No. 19

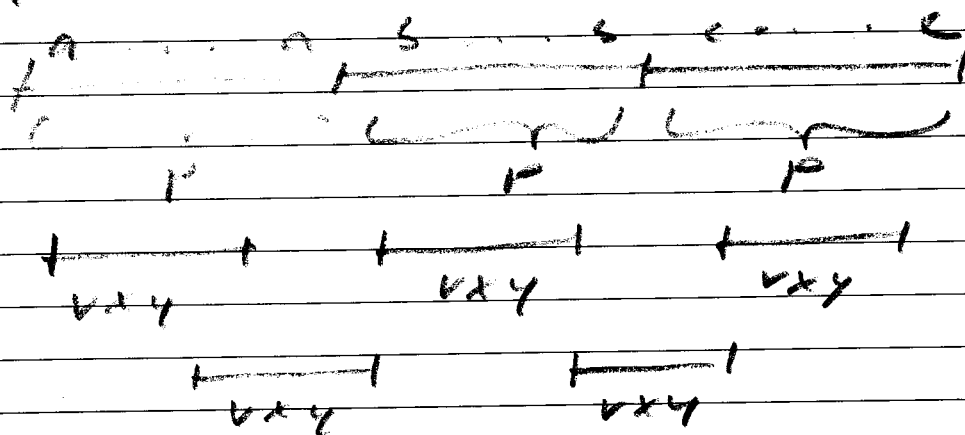
Ex. $B = \{a^n b^n c^n \mid n \geq 0\}$ is not a CFL

Assume B is a CFL

$\exists p$ st $\forall s \in B$, $|s| \geq p$ and $s = uvxy \neq \epsilon$
where:

1. $|vxy| \geq 1$
2. $|vxy| \leq p$
3. $\forall i \geq 0$, $uv^i xy^i z \in B$

Consider $s = a^p b^p c^p$. By (1) and (2), vxy must be either:



i.e. all are char or on the boundary of a char

Case A: vxy in a single block. pumping up will give more a 's / b 's / c 's than the other two letters. no longer in B . contradiction

Case B: vxy on boundary. Pumping up will add more a 's / b 's OR b 's / c 's than the other third letter. s no longer in B . contradiction

A more exs of this in slides today

Date. _____

No. _____

Ex. $D = \{ww \mid w \in \{0,1\}^*\}$ is not CFL

Assume D is a CFL:

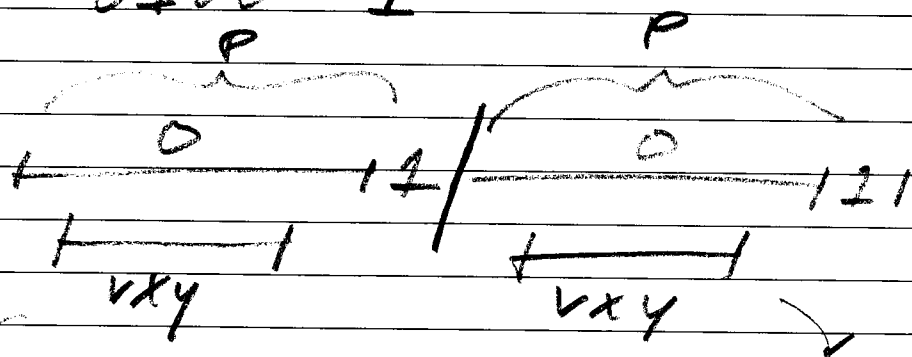
$\exists p$ st $\forall s \in D, |s| \geq p$ and $s = uvxy^iz$
where:

1. $|vy| > 0$

2. $|vxy| \leq p$

3. $\forall i \geq 0, uv^ixy^iz \in D$

Consider $s = 0^p 1 0^p 1$. This divides into
 $0^p 1 0^p 1$



it pump down, less zeros in first half than second
vice versa

Turing Machines

Date. 11/13/25
No. 22

Estimating p in CFGs

Assume G is a CFG where $b = \max \# \text{ symbols in } R \cup L$

$A \rightarrow a_1 a_2 \dots a_b$ where a_i is term or nonterminal

Thus no vertex can have more than b children

Thus if height $= h$, no more than b^h leaves

Thus if $|s| \geq b^{h+1}$ leaves, must have
at least $h+1$ height

With $|V|$ nonterminals, height of $|V|+1$

has at least 2 repeated nonterminals
so has up to $b^{|V|+1} + 1$ leaves

So p must be no bigger than $b^{|V|+1}$

Turing Machines: computing with Read/Write
tapes

Are there limits to PDAs? YES

the stack can't remember an arbitrary
 n twice!

Turing Machine (TM) Model:

7-tuple: $(Q, \Sigma, \delta, q_0, q_{\text{accept}}, q_{\text{reject}}, \Gamma)$

Q, Σ, q_0 as before

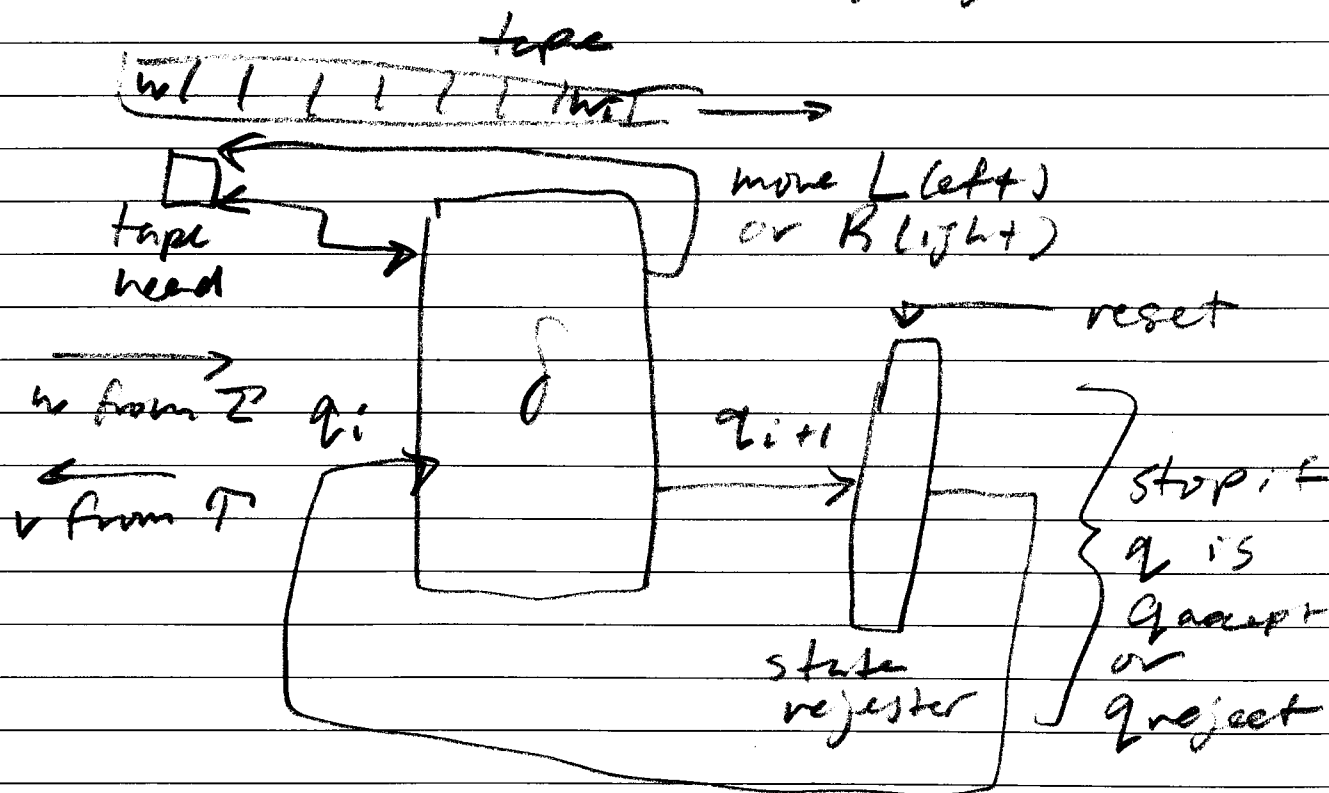
Γ : symbols that may be written

$$\Sigma \subseteq \Gamma$$

q_{accept} : stop and accept state

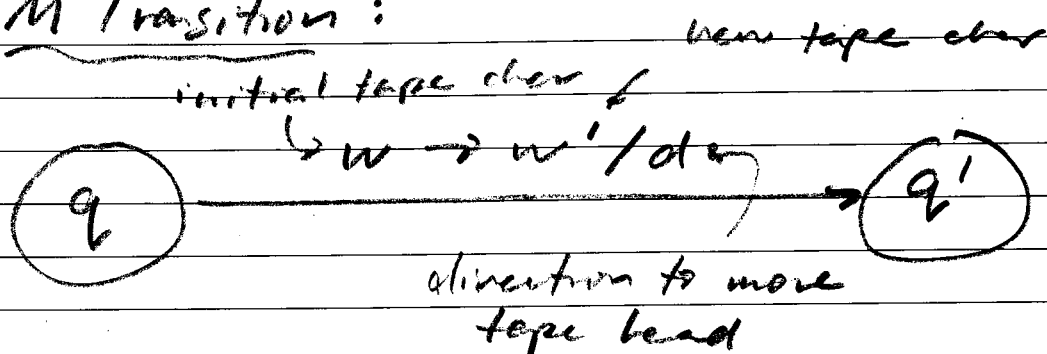
q_{reject} : stop and reject state

$$\delta: Q \times \Gamma \rightarrow Q \times \Gamma \times \{\text{Left}, \text{Right}\}$$



no nondeterminism (for now) $\emptyset$

TM Transition:



read symbol under tape head: w

given current state q , find $f(w, q) = (w', q', d)$

TM differences from PDA:

1. tape is infinite size
 - only leftmost holds initial data
 - rest holds $\square$ (blank)
 - $\square \in \Gamma$ (always)
2. can write to tape
3. can move left on tape
4. halts as soon as enters either
 - q_{accept} q_{reject}
5. BUT can loop forever!

DTMs and Languages:

Assume M is a DTM and L is a language

M recognizes L if given any string w

if $w \in L$, $M(w)$ halts in accept

if $w \notin L$, $M(w)$ never halts in accept

• but may halt in reject or loop forever

M decides L if given any string w

if $w \in L$, $M(w)$ halts in accept

if $w \notin L$, $M(w)$ halts in reject

Language of L : set of all strings $w \in L$ that
is accepted in $M(L)$

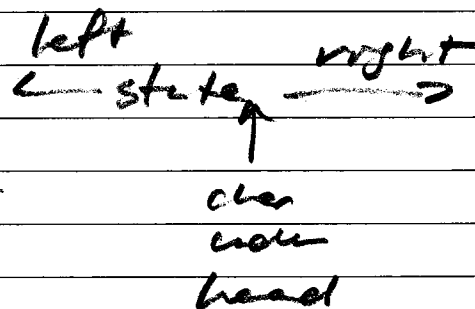
Recognizing $a^n b^n c^n$

Turing Machine Variations

Date. 11/18/25
No. 23

A configuration C :

- current state
- current tape contents
- current head location



TM transition:

- change from one configuration C_i to another C_{i+1} that obeys TM transition rules

$C_i = \underbrace{u_i}_{\text{left}} q_i \underbrace{v_i}_{\text{right}}$ more formally

TM Variations:

- stay option: "S" direction to not move head
- multiple tapes: each independent of each other

$$\delta: Q \times \Gamma_1 \times \dots \times \Gamma_k \rightarrow Q \times \Gamma_1 \times \dots \times \Gamma_k \times \{L, R, S\}^k$$

- bi-directional infinite tape:
- TM with a stack
- Queue Automata: replace tape w/ infinite queue
- Non-deterministic transitions
- Two stack machine
- Probabilistic Turing Machine

Enumerators: useful type of DTM

- DTM + printer
- programmed with grammar of some language L
- starts with blank tape
- generates and prints out all strings in L
 - possibly random order
 - may go on forever

"enumerates L "

Theorem. L is Turing-recognizable iff
some enumerator enumerates it

Proof. Assume enumerator E

given string w , is it in L

compare output of E

if in L , eventual match

if not in L , and L infinite, E never halts

given recognizer M , how to build E

generate all possible strings in Σ^*

run each through M

if M accepts it, print it out

Result. None of these variations are more
powerful than basic TM

Eg. simulating k -tape TM on 1-tape

single tape = $\$1 \dots \text{tape 1} \dots \# \text{tape 2} \dots \$ \dots \text{tape } k \dots \#$

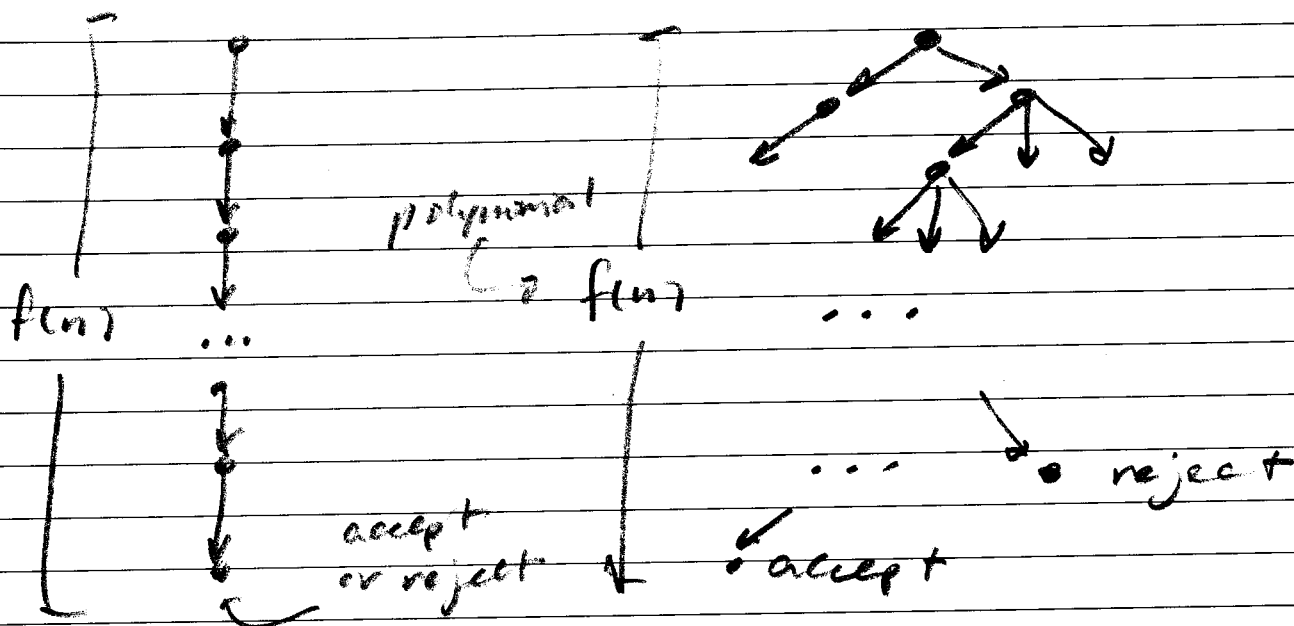
if time on k -tape is $t(n)$, 1-tape runs
in $t^2(n)$ time

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No. 24

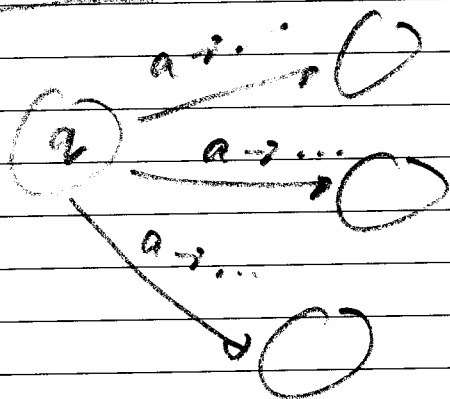
Nondeterministic



if $|Q|$ states, in fact true at most

transitions:

$19, f^{(n)}$ branch points



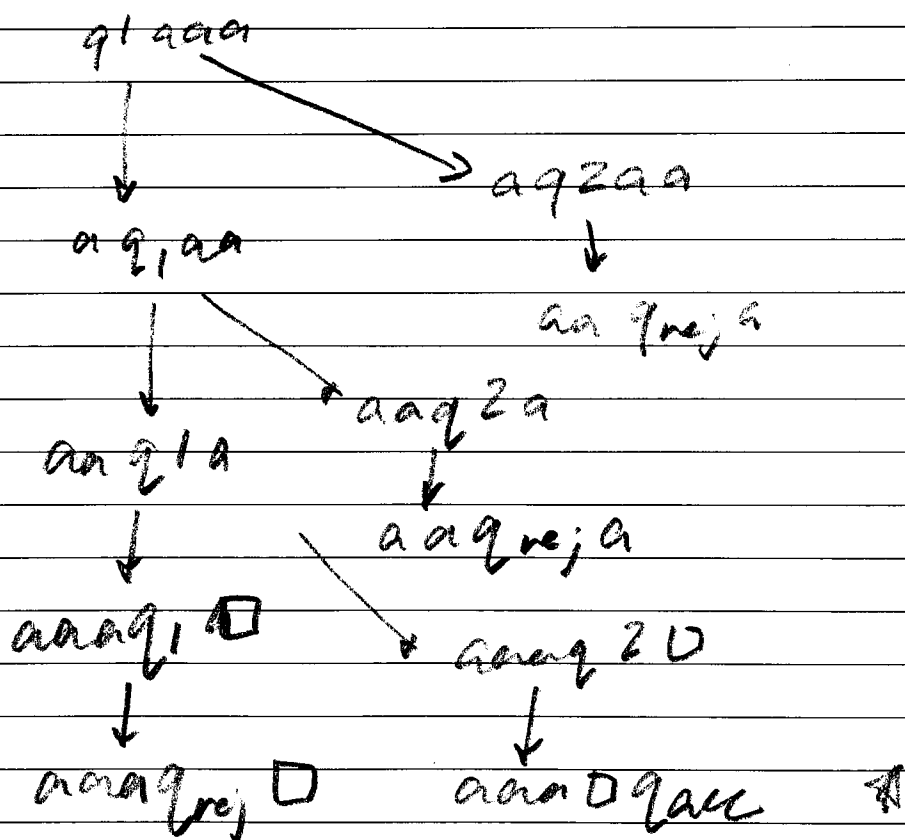
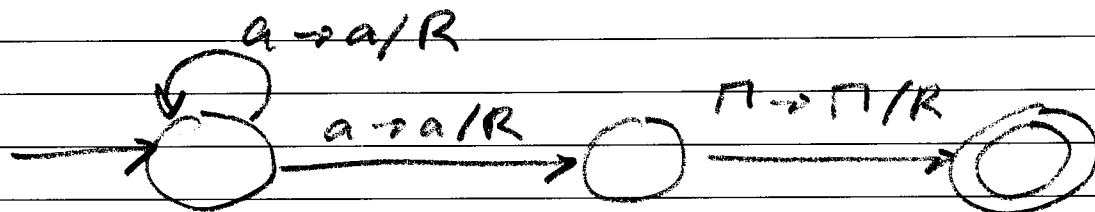
in state q , if "a" on tape, multiple options available

If a NTM can solve a problem in $O(f(n))$, then a DTM can solve it in $O(1Q_1 f(n))$

Non-deterministic Algorithms

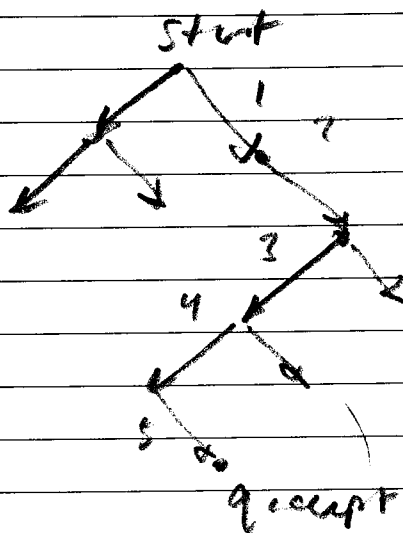
1. Generate (non-deterministically) a certificate
2. Run certificate and problem through DTM
Verifier and return answer

Ex. Accept a^+



* Ex: given string 1^n , is it composite?
in slides!

Timing an NTM :



shortest path from
start to qaccept

5

Language Recognition : for language L

recognizable :

- always accepts $\forall s \in L$
- never accepts $\forall s \notin L$

decidable : automaton recognizes it and
always halts!

timely-recognizable : iff NTM recognizes it

timely decidable : iff NTM decides it

Definitions .

Computability: ability to answer a question
w/ a mechanical process

Automaton: performs a function according to
a predetermined set of coded instructions

Function: $f: D \rightarrow R$

Effectively Computable: computable by a well-defined
mechanical process

Church-Turing Thesis: Any function over $\mathbb{N}$ is
computable iff computable by a TM

Gödel and Herbrand: General Recursive Functions

can make $f: \mathbb{N} \rightarrow \mathbb{N}$ using just constant, projection,
successor

Peano's Axioms: all you need for arithmetic

• $0 \in \mathbb{N}$

• $\forall x, y$, if $x=y$ then $y=x$...

• $\exists$ successor function $S(x)$...

• details in slides

Kurt Gödel's Incompleteness Theorem:

if a system is consistent, it cannot be
complete vice versa

• details in slides

Big O:

if $f(n) = \# \text{ steps in TM}$

$g(n): \mathbb{N} \rightarrow \mathbb{R}$

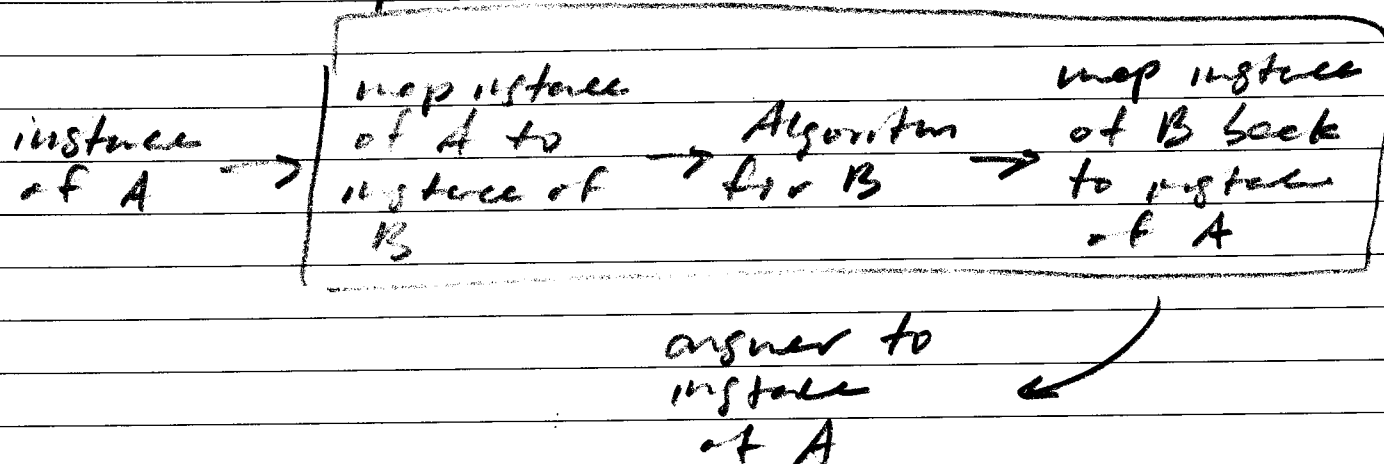
$f(n) = O(g(n))$ if $\exists n_0 \in \mathbb{N}$ and $c \in \mathbb{R}$

$\forall n \geq n_0, f(n) \leq c g(n)$

Reducibility, Decidability

Date. 12.2.25
No. 26

Reducibility: showing problem A is as simple as problem B



$$\text{Complexity of A} = O(\text{Map } A \rightarrow B) + O(B) + O(\text{Map } B \rightarrow A)$$

More formally,

$f: D_f \rightarrow R_f$ is reducible to $g: D_g \rightarrow R_g$ if

$\exists h: D_f \rightarrow D_g$ and $\exists q: R_g \rightarrow R_f$ st.

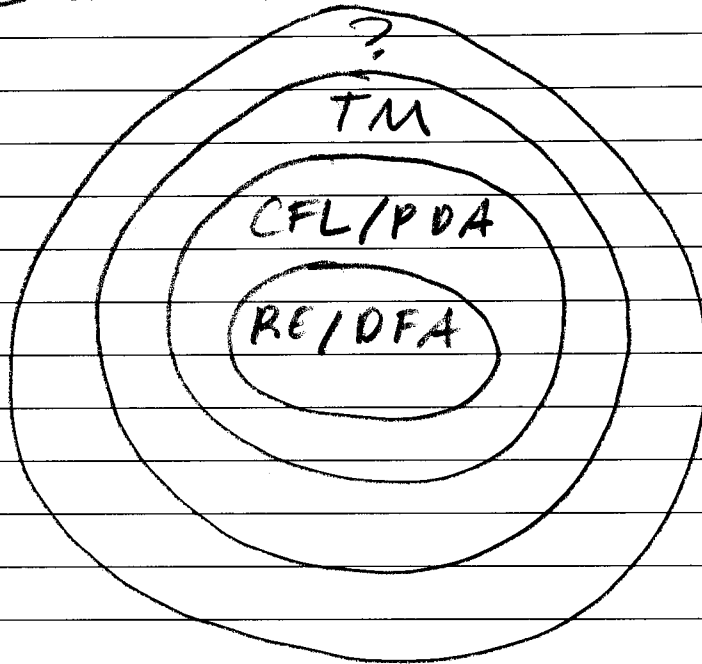
$$\forall x \in D_f, f(x) = q(g(h(x)))$$

$$x \in A \rightarrow y = h(x) \rightarrow z = g(y) \rightarrow \underline{b} = p(z) \rightarrow \underline{b} \in A$$

$$\text{Complexity of A} = O(h(x)) + O(g(y)) + O(p(z))$$

A cxs of thrs in slides 4

Decidability, Languages, Automata :



Language classes based on type of automata needed for decider

Decidability, Complexity

Date. 12.4.25
No. 27

Ex. from Quiz 12

Assume problem class A can be reduced to problem class B

i.e. $A \leq B$, meaning B is at least as hard as A

a) if there exists a polynomial solver for B , then A is polynomial!

b) if there exists an exponential solver for B , then A solver for A is known to exist, but of unknown complexity

intuition, $A \leq B$ means:

1. You can turn an instance of A to an instance of B in polynomial time
2. If you can solve B , then you can solve A
- * 3. The complexity of the solver for B is an upper bound for the solver for A

c) if no solver for B can exist, then:

we cannot tell if A has a solver

d) if no solver for A can exist, then:

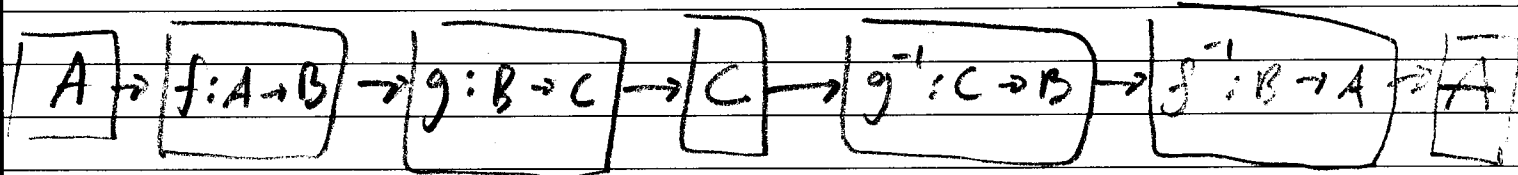
B cannot have a solver

Another Ex. Three classes of problems A, B, C

A reduces to B , and B reduces to C

ie. $A \leq B \leq C$

Draw a picture of this chain, starting with A :



- if C has polynomial decider? so does A, B
- if B has polynomial decider? A is poly, C unknown
- if A has poly decider? tells us nothing
- if C has exponential decider? A, B are decidable, unknown complexity
- if B has exp decider? A is decidable, C unknown
- if A has exp decider? tells us nothing
- if C cannot be solved? tells us nothing
- if B cannot be solved? C cannot be solved, no info about A
- if A cannot be solved? Both B and C cannot be solved either
- if $C \leq A$, and is polynomial? all 3 polynomial
- if $C \leq A$, and is undecidable? all 3 undecidable

Undecidability:

Decision problem: problem posed as a yes/no question
decision problem for which an algorithm

Decidable: exists that always leads to a
correct answer to a decision problem

Undecidable: decision problem for which it's
proved to be impossible to construct
an algorithm that always leads to
the correct yes/no answer

Non-Decision Problems and Verifiers:

desired result more than a yes/no

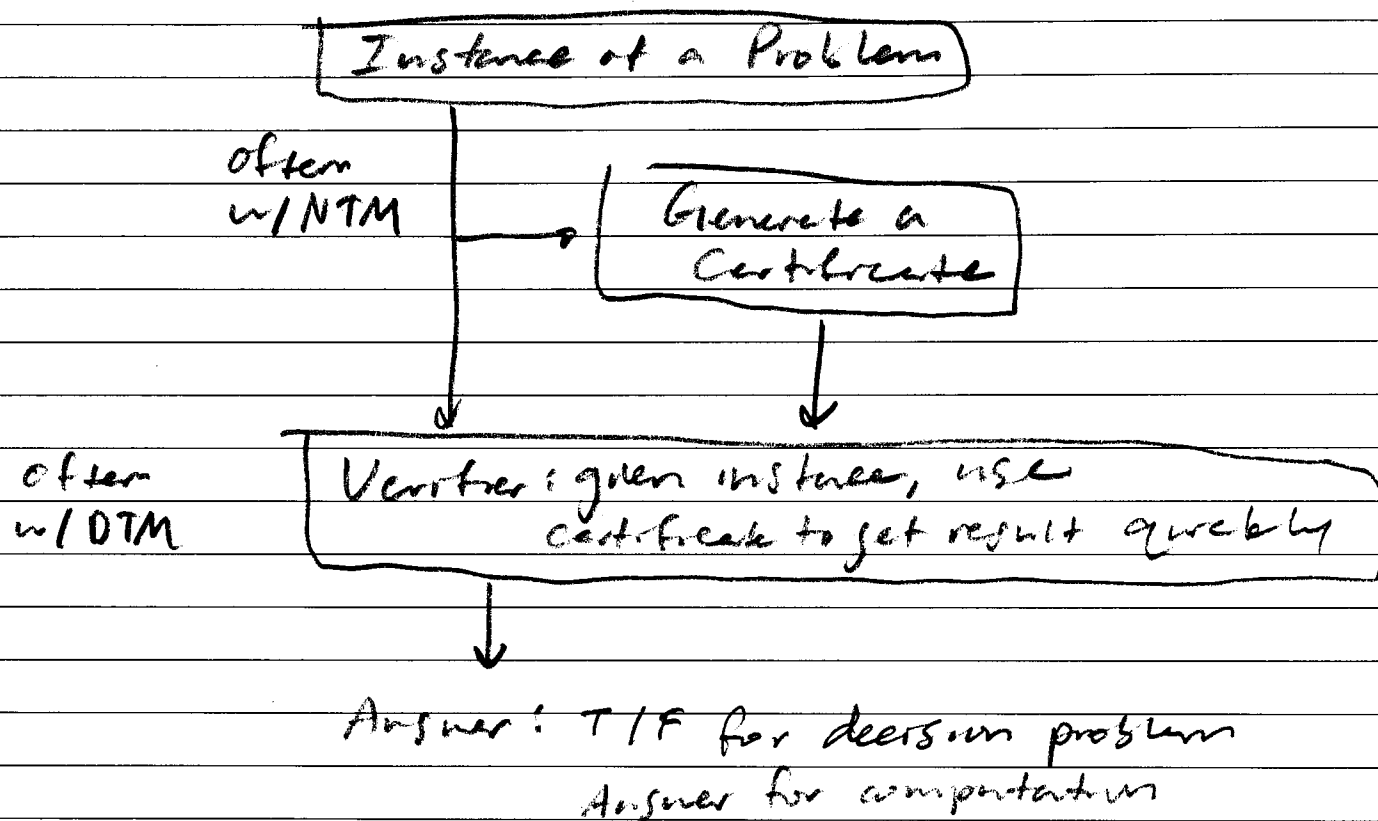
Verifier: V for language L : function f that
for any string w :

- $w \in L$, $\exists f(w) = c$ where V accepts (w, c)
- $w \notin L$, no such c exists

Certificate: string c (key, solution)

exs. nonprime: w is a number, c is a divisor
Hamiltonian: w is a graph, c is a sequence
of vertices

Solution via Verification:



intuition: many "tough" problems can be "solved" quickly with a "hint"

Verification often doable w/ DTM in poly time

Generating hint often possible with NTM

Languages over Automata:

Consider $L = \{ \langle B, w \rangle \mid \langle B, w \rangle \text{ has some property} \}$

B : "Encoding" description of some automaton B
as a string
i.e. express each element of formal model tuple
as a string

w : Some possible input string for that TM

Property: string $\langle B, w \rangle \in L$ if B does something with w

Properties of such Languages:

Turing Decidable: TM decider that always answers
Yes/No

Turing Recognizable: TM recognizer exists where

- Always stops and answers yes if $\langle B, w \rangle$ has property
- Never answers yes if $\langle B, w \rangle$ does not have property
- And might loop forever if not yes

Turing Undecidable: may be recognizable but not decidable

Co-Turing Recognizable: recognizer for complement of L

* list of classes of languages in slides / worksheet

The Halting Problem:

Consider $A_{TM} = \{ \langle M, w \rangle \mid M \text{ is a TM which accepts } w \}$

Recognizer D emulates M on w and stops when M accepts

Assume decider H exists:

- stops in q_{accept} if M halts
- stops in q_{reject} if M loops and never halts

Define D : takes $\langle M \rangle$, runs H on $\langle M, M \rangle$, outputs opposite of H

Run D on itself: on $\langle D, D \rangle$

- D halts and accepts if its simulated D rejects itself
- D halts and rejects if its simulated D accepts itself

Contradiction: Thus H cannot exist!

we can never decide yes/no if a TM will go into an infinite loop

i.e. A_{TM} is undecidable!

Further Theorems:

Theorem 4.22: Language is decidable exactly when both it and its complement are Turing recognizable

Theorem 4.33: Complement of A_{TM} is not Turing Recognizable (if it were, then A_{TM} would be Turing-decidable)

Complexity Classes of Problems:

divides problems based on TM solver time complexity as a function of length of input tape

Class P (Polynomial): some 1-tape DTM can solve it in $O(n^k)$ time for some k

Class NP (Non-deterministic Polynomial): some NTM can solve it in $O(n^k)$ for some k

Class NP-Complete: any problem in NP can be solved by reduction to a solver in this class

⚡ If any NP-complete problem is in P, then all of NP is ⚡

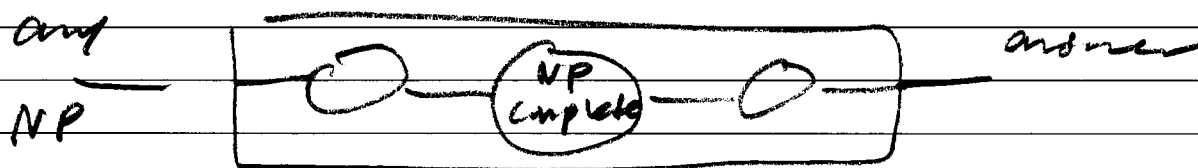
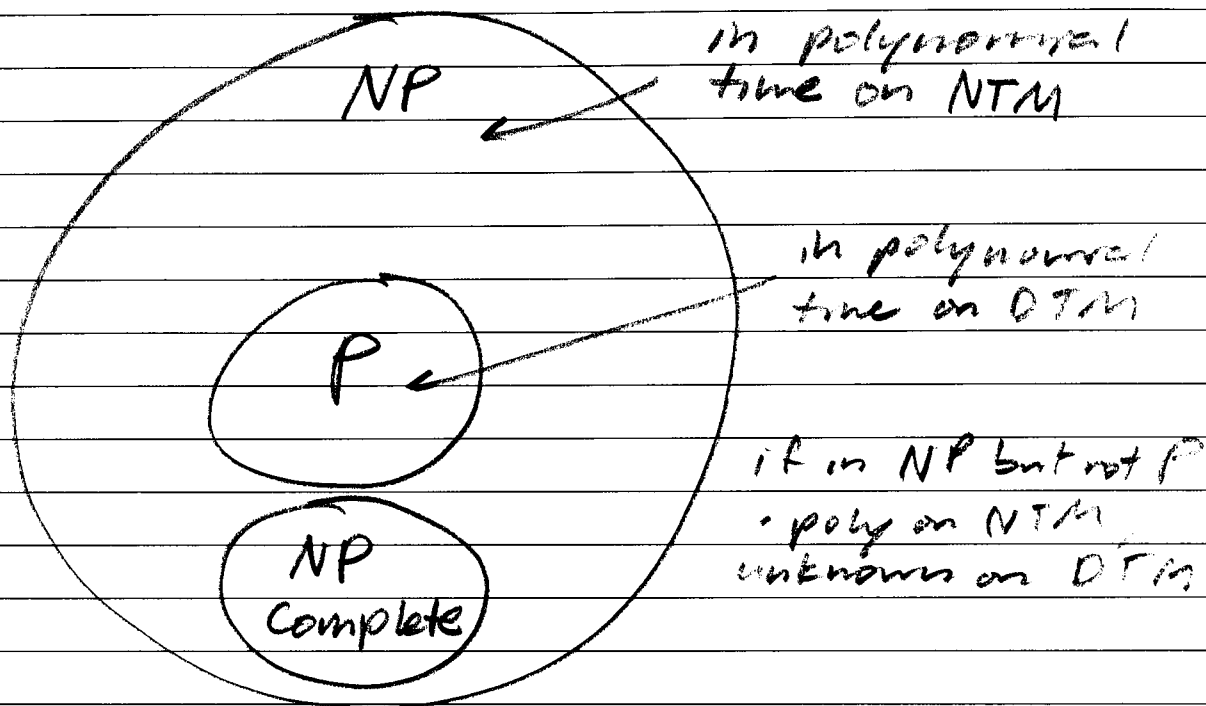
Note, more details and exs of these in slides

Does $P = NP$? Is there any NP complete problem that is in P?

NP-Hard: a class of problems at least as hard as NP but bigger than NP

Date. 12.9.25
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Final Exam Review



universal solvers, can be reduced for any NP problem

Date. _____
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