

## Turing Machine

§

3-18<sup>th</sup>

No.

Date

Push-down Automaton:

Recap:

- \* Read from Tape
- \* Move to right
- \* write the stack
- \* Entering final state  
not imply end
- \* non-deterministic

Turing Machine:

- \* Read from Tape
- \* Move to right or left
- \* write to tape
- \* Entering halting state  $\left\{ \begin{array}{l} \text{yes acc} \\ \text{no non-acc.} \end{array} \right.$   
imply end

\* deterministic

conventions

l rhd (triangle)

Tape: \*  $\triangleright$  at left end  $\triangleright$  not at any other states

\*  $\sqcup$  blank ( $\neq \epsilon$ )

R/W head:

\* initial position: usually  $\triangleright \sigma \sigma \sigma \dots$

\* Never moves off the left end of tape

Operation: At each step, read current symbol

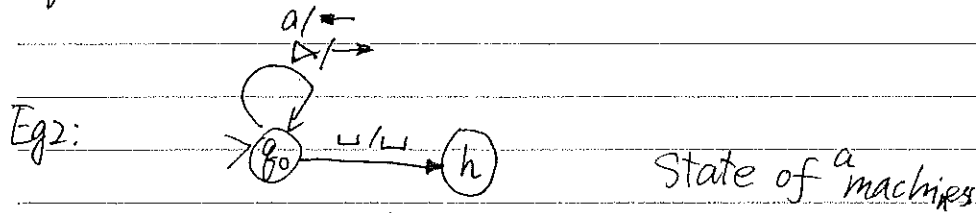
\* move to the next state

\* the head: Write Symbol at current square  
or move left or right

Configuration:

$(q_0, \triangleright a, a) \vdash (q_1, \triangleright \_, a) \vdash (q_0, \triangleright \_, a) \vdash (q_1, \triangleright \_, \_)$   
 $\vdash (q_0, \triangleright \_, \_) \vdash (h, \triangleright \_, \_)$

$(q_0, \triangleright \_ aa)$   $(q_0, \triangleright aa \_ \_)$   
 $(q_0, \triangleright a \_ a)$



$(q_0, \triangleright \_ aa) \vdash (h, \triangleright \_ aa)$

$(q_0, \triangleright aa) \vdash (q_0, \triangleright aa) \vdash (q_0, \triangleright aa) \vdash \dots$

State Diagram

Rule Table

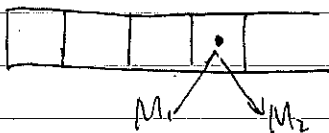
§ Graphical Notation for Turing Machine.

Basic Machines.

$\sigma \in \Sigma - \{\triangleright\}$   
 $M\sigma$  Write  $\sigma$  } short hand  $\sigma$

$M \rightarrow$  Move to the right R

$M \leftarrow$  Move to the left L

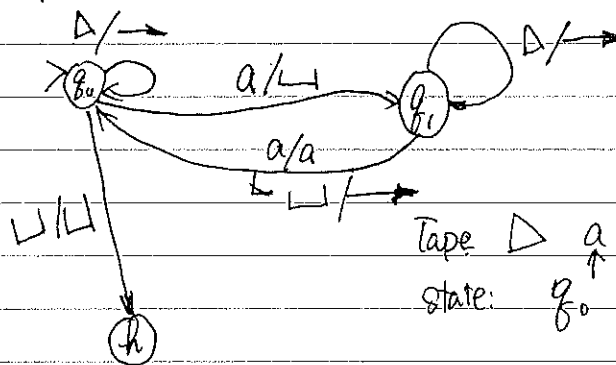


Math Def: $K$ : set of states $\Sigma$ :  $\{\Delta, \sqcup\} \in \Sigma$  $\{\rightarrow, \leftarrow\} \notin \Sigma$  $S \in K$ : initial state $H$ : set of Halting states,Transition

$$\delta(q, a) = (p, b)$$

$\uparrow$  current state     $\uparrow$  current symbol     $\uparrow$  next state     $\uparrow$  action
   
 write  $b$ :  $b \in \Sigma$ 
  
 move:  $b = \leftarrow, \rightarrow$

$$\delta: K \times \Sigma \rightarrow K \times (\Sigma \cup \{\leftarrow, \rightarrow\})$$

\*  $\delta(q, \Delta) = (p, \rightarrow)$  must be in every TM.\*  $\delta(q, a) = (p, b)$   $b \neq \Delta$ Example:  $M = \{K, \Sigma, \delta, s, \{h\}\}$ 

Tape:  $\Delta \ a \ a$   
 state:  $q_0$

Tape:  $\Delta \ \sqcup \ a$   
 state:  $q_1$

Tape:  $\Delta \ \sqcup \ a$   
 state:  $q_0$

Tape:  $\Delta \ \sqcup \ \sqcup$   
 state:  $q_1$

Tape:  $\Delta \ \sqcup \ \sqcup \ \sqcup$   
 state:  $q_0$

Tape:  $\Delta \ \sqcup \ \sqcup \ \sqcup$   
 state:  $h$

short hand

first

$>R \rightarrow a$

$Ra$

move right <sup>first</sup> write a

$>R \rightarrow R$

$R^2 (L^2)$  move two steps to the right

$>R \rightarrow L$

$R \sqcup : (L \sqcup)$

move right until non-blank  $\sqcup$

$>R \rightarrow \sigma \neq \sqcup$

$R \sqcup (L \sqcup)$

E.g. move right until a blank

M:

$>R \sqcup \rightarrow L \sigma$

$\Delta \sqcup \sqcup \sqcup a$

M:

$R \sqcup : \Delta \sqcup \sqcup \sqcup a \quad \sigma = a$

$L \sigma : \Delta \sqcup \sqcup \underline{a} a$

$\Delta a \sqcup a$

$\geq a \sqcup a$

M:

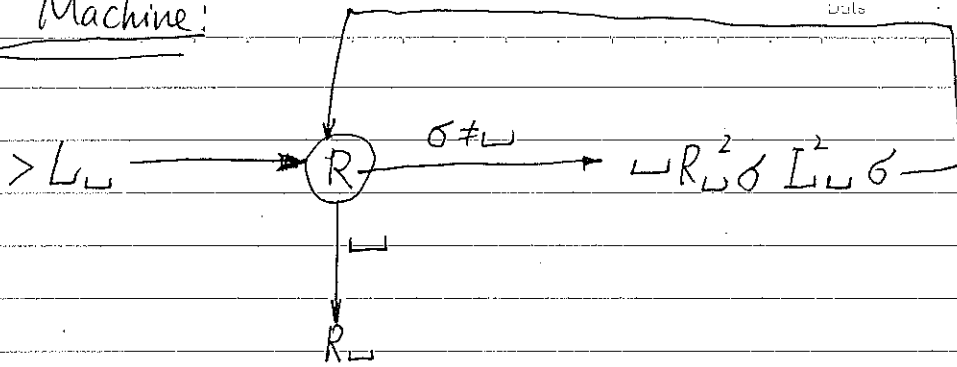
$R \sqcup : \Delta a \sqcup a$

$R \sqcup \Delta a \sqcup a$

$L \sigma : \Delta a a a$

$L \sigma \Delta a$

## Copying Machine:



$\triangleright \sqcup ab \sqcup$   
 $\sqcup \triangleright \sqcup ab \sqcup$

$R \triangleright \sqcup ab \sqcup$

$\sigma = a$

\*TM are algorithms

$\sqcup \triangleright \sqcup \sqcup b \sqcup$

\*TM can be given verbally.

$R^2 \triangleright \sqcup \sqcup b \sqcup \sqcup$

$\sigma \triangleright \sqcup \sqcup b \sqcup a$

$L^2 \triangleright \sqcup \sqcup \sqcup b \sqcup a$

$\sigma \triangleright \sqcup a b \sqcup a$  Go to R

$R: \triangleright \sqcup a \sqcup a$

$\sigma = b$

$R: \triangleright \sqcup ab \sqcup ab \sqcup$

$\sqcup: \triangleright \sqcup a \sqcup \sqcup a$

$R_1: \triangleright \sqcup ab \sqcup ab \sqcup$

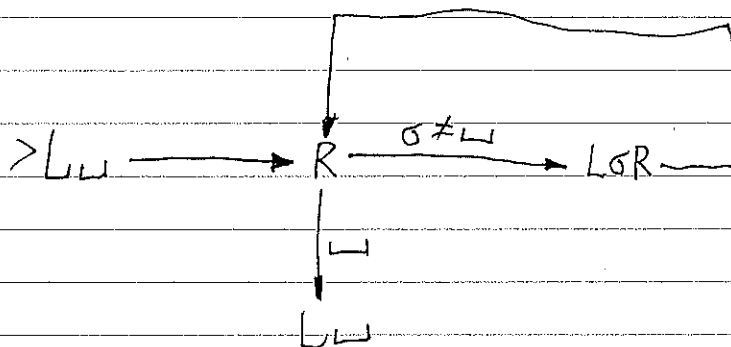
$R^2 \triangleright \sqcup a \sqcup \sqcup a \sqcup$

$\sigma \triangleright \sqcup a \sqcup \sqcup a \sqcup b$

$L^2 \triangleright \sqcup a \sqcup \sqcup ab$

$\sigma \triangleright \sqcup ab \sqcup ab$  Go to R!

Examples:

Left shifting machine  $S \leftarrow$  $\triangleright \sqcup abb \sqcup$  $\sqcup \triangleright \sqcup abb \sqcup$  $R: \sqcup \sqcup abb \sqcup \quad \sigma = a$  $LOR: \triangleright a \sqcup abb \sqcup$  $R: \triangleright a a \sqcup b \sqcup \quad \sigma = b$  $L: \triangleright a \sqcup abb \sqcup$  $OR: \triangleright a b \sqcup b \sqcup$  $R: \triangleright a b \sqcup b \sqcup \quad \sigma = b$  $LOR: \triangleright a b \sqcup b \sqcup$  $R: \triangleright a b \sqcup b \sqcup \quad \sigma = \sqcup$  $\sqcup \triangleright a b \sqcup b \sqcup \sqcup$

# § Lecture 15:

## Language Recognizer

DFA  $M$ :  $\ast (s, w)$  always halts (the length of  $|w|$ )

$\ast (s, w) \vdash_M^{\ast} (f, e) : M \text{ accepts } w$

$\ast M$  accepts a language  $L$  iff

- (1)  $w \in L \implies M \text{ accepts } w$
- (2)  $w \notin L, M \text{ rejects } w$

$\ast L$  is a regular language

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

Idea:  $\triangleright \sqcup aabbcc$   $\ast$  Replace first symbol in each block by  $d$

$\triangleright \sqcup dadbdc$   $\ast$  Repeat

$\triangleright \sqcup dddddd$   $\ast$  If run out of a's & b's & c's at the same time (pass) accepts if not, reject

Detail:

$\triangleright \sqcup aabbcc$	$dR: \triangleright \sqcup dadbdc$	$dR$ (and in the graph)
$R: \triangleright \sqcup aabbcc$	$R: \triangleright \sqcup dadbdc \sqcup$	
$\sqcup R: \triangleright \sqcup dabbcc$	$\sqcup L: \triangleright \sqcup dadbdc \sqcup$	
$\sqcup R: \triangleright \sqcup dabbcc$	$\sqcup R: \triangleright \sqcup dadbdc \sqcup$	
$R: \triangleright \sqcup dabbcc$	$R: \triangleright \sqcup dadbdc \sqcup$	
$\sqcup R: \triangleright \sqcup dadbcc$	$dR: \triangleright \sqcup dddbdc \sqcup$	
$R: \triangleright \sqcup dadbcc$		

R:  $\triangleright \_ d d d b d c \_$

dR:  $\triangleright \_ d d d d d c \_$

R:  $\triangleright \_ d d d d d c \_$

dR:  $\triangleright \_ d d d d d d \_$

$\emptyset$

$\_ \triangleright \_ d d d d d d \_$

R:

$\vdots$

R  $\triangleright \_ d d d d d d \_$

Y acc.

$\hookrightarrow$  (goto yes state)

Eg2:  $\_ \triangleright \_ a b \_$

R:  $\_ \triangleright \_ a b \_$

dR:  $\_ \triangleright \_ d b \_$

dR:  $\_ \triangleright \_ d d \_$

N:

[Eg.]

$a^i b^j c^k \quad i+j=k$

$\_ \triangleright \_ a a b b c c c \_$

$\_ \triangleright \_ a a \text{xxxx} c c \_$  one a run use b to cross C

$\_ \triangleright \_ a a b b \text{xx} c c \_$

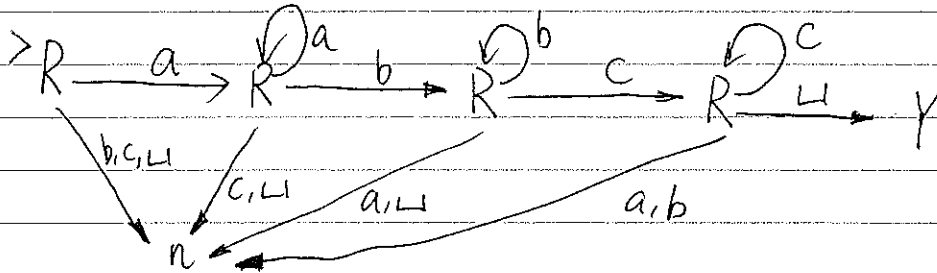
$\_ \triangleright \_ \text{xx} \text{xx} \text{xx} \text{xx} \_$



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T.M. for step 1. (graphical representation)



Bonus Question T.M. for step 3.

Compute Functions:

$$(S, \triangleright \sqcup w) \vdash^* (h, \triangleright \sqcup y)$$

$\uparrow$  Input  $\uparrow$  output  
 $y = f(w)$

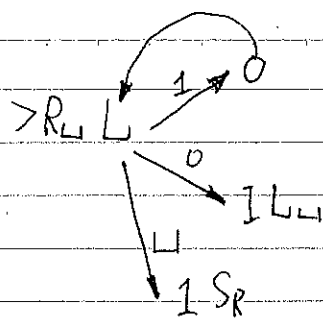
f: Recursive function

Successor function

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

n	10	11	15
binary	1010	1011	1111

n+1      1011      1100      10000



( $S_r$ : right shifting machine)

$\Delta \underline{1010}$	$\Delta \underline{1011}$	$\Delta \underline{1111}$
$R_L \Delta \underline{1010}$	$R_L \Delta \underline{1011}$	$R_L \Delta \underline{1111}$
$L \Delta \underline{1010}$	0 $\Delta \underline{1010}$	0L: $\Delta \underline{1110}$
$1L \Delta \underline{1011}$	L: $\Delta \underline{1010}$	0L: $\Delta \underline{1100}$
	0L: $\Delta \underline{1000}$	0L: $\Delta \underline{1000}$
	1L: $\Delta \underline{1100}$	0L: $\Delta \underline{0000}$
		1: $\Delta \underline{0000}$
		SR: $\Delta \underline{10000}$

# § Lecture 3/25

TM:  $M$  decides  $L \subseteq \Sigma_0^*$

\*  $\forall w \in \Sigma_0^*, M$  halts on  $w$

\* if  $w \in L$ ,  $M$  accepts  $w$  (y state)

\* if  $w \notin L$ ,  $M$  rejects  $w$  (N state)

$L$ : recursive/Turing-decidable:  $a^n b^n c^n$ ;  $a^i b^j c^k \quad i+j=k$

TM computes function

\*  $(S, \Delta \sqsubseteq w) \vdash (h, \Delta \sqsubseteq y)$   
 $y = f(w) \quad \text{succ}(n) = n+1$

$M$  ~~semi~~ semi decider  $L$  iff:

\* if  $w \in L$ ,  $M$  halts on  $w$

\* if  $w \notin L$ ,  $M$  does not halt on  $w$

$L$ : Recursively enumerable

Note: can never decide  $w \notin L$

$L = \{w \in \{a, b\}^*, w \text{ contains at least one } a\}$

$M_1$ :   
 $w \in L \quad w \dots a \dots$   
 $w \notin L \quad b \dots b \dots$

$M_1$  semi-decides  $L$ .

$L$  also recursive

$M_2$ : decides  $L$

$D \sqsubseteq bbbab \dots$   
 $D \sqsubseteq bbbb \dots$

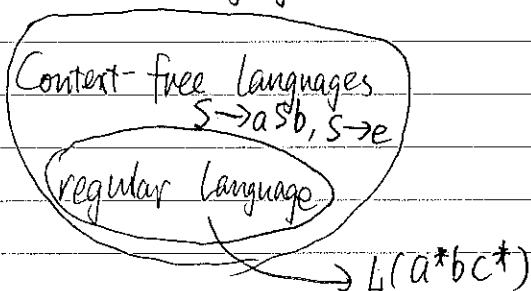
Theorem 1:

Proof: change the IV machine.

non-recursively enumerable?

Recursively enumerable?

Recursive languages  $a^n b^n c^n$



CFG  $\subset$  R

Show that recursively enumerable = Recursive lang.  $\oplus$

Preparation: All context free grammars can be written into Chomsky Normal Form.

Type 1:  $X \rightarrow \underline{y}z$

Type 2:  $X \rightarrow \sigma (\sigma \neq \epsilon)$

$S \rightarrow \epsilon$  allowed only if  $\epsilon \in L$

Eg.  $S \rightarrow aSb \quad S \rightarrow \epsilon$

$S \rightarrow AX$

$X \rightarrow SB$

$A \rightarrow b$

$B \rightarrow b$

$S \rightarrow AX \rightarrow ASB \rightarrow \cancel{S}XB$   
 $\rightarrow \cancel{S}A \rightarrow AAXB \rightarrow AASBB$

Derivation with Normal form:

\* Apply Type 1 rules,  $k$  times  
 $k+1$  non-terminals  
 \* Apply Type 2 rules  $k+1$  times  
 length of word  $= k+1$

$2k+1$  steps:  $\Rightarrow L_{n-1}$   
 $n = k+1$

\*  $w, |w| = n$   
 Derived in  $2n-1$  steps

$CFG \subseteq recursive$

Proof:

\*  $L$  generated by  $CFG$   $G$

\* Assume  $G$  is in the normal Form.

\*  $w, |w| = n, w \in L$ ?

\* List all words generated in  $2n-1$  steps.

\* If  $w$  is one of them, yes  
 If not no

Mechanic  
 can be  
 done using  
 TM.

§ Mile Stone. (notes from 4.16)

\* Course objective:

show some problems cannot be solved using algos.

\* what are algos?

procedure, Recipes

\* Intuitive notion: Set of instructions for carrying out some task:

(informal cannot be used in Proofs:)

\* mathematical models: DFA, NFA, PA Limited in Power:

\* Turing Machines:

\* Is TM General Enough?

\* Attempt to come up even more general models?

\* Extend TM:

\* other math models: unrestricted grammar,

→  $\lambda$  calculus  
post-production system,  
by Turing himself

\* All of those are actually equivalent to Turing Machine

Church-Turing Thesis:

TM = ALGORITHMS

$$ax^2 + bx + c = 0$$

$$x = \frac{-b \pm \sqrt{b^2 - 4ac}}{2a}$$

Hilbert's 21 Q's

Problem:

$$a_0x^n + a_1x^{n-1} + \dots + a_n = 0$$

Does the equation have closed-form solution!  
algebraic

↓ Second Further  
reading

# 1. Multi Tape TM:

M1: 2-tape copying machine

objective

T1:  $\triangleright \sqcup ab$

T1:  $\triangleright \sqcup ab \sqcup ab$

T2:  $\triangleright \sqcup$

T2:  $\triangleright \sqcup$

Multi tape  $\Leftrightarrow$  TM

Proof:

standard TM,  $M_2$

multiple steps

$\triangleright \# \sqcup ab \# \sqcup$

↑  
head position of  $M_2$

Virtual heads of  $M_1$

T1:  $\triangleright \sqcup ab$

T2:  $\triangleright \sqcup$

1. T1:  $\triangleright \sqcup a b$

T2:  $\triangleright \sqcup a$

2. T1:  $\triangleright \sqcup ab$

T2:  $\triangleright \sqcup ab$

3. T1:  $\triangleright \sqcup ab \sqcup$

T2:  $\triangleright \sqcup ab \sqcup$

4. T1:  $\triangleright \sqcup ab \sqcup$

T2:  $\triangleright \sqcup ab \sqcup$

5. T1:  $\triangleright \sqcup ab \sqcup a$

T2:  $\triangleright \sqcup ab \sqcup$

6. T1:  $\triangleright \sqcup ab \sqcup ab$

T2:  $\triangleright \sqcup ab \sqcup$

7. T1:  $\triangleright \sqcup ab \sqcup ab \sqcup$

T2:  $\triangleright \sqcup ab \sqcup$

1.3.  $\triangleright \# \sqcup ab \sqcup \# ab \sqcup$

shift it to right

1.1.  $\triangleright \# \sqcup ab \# \sqcup a$

$\rightarrow R \sqcup L R (\delta = a) \delta$

$R \sqcup L R \delta L \#$

# Nondeterministic TM

\* TM is deterministic

$$\delta: (K-H) \times \Sigma \rightarrow K \times (\Sigma \cup \{\leftarrow, \rightarrow\})$$

$$(p, a) \mapsto (q, b)$$

↑    ↑  
state char

Computation is sequential

$$(S, \Delta \dots) \mapsto (P_1, \Delta, \dots) \mapsto (P_2, \Delta, \dots) \dots$$

\* Non deterministic TM (NTM)

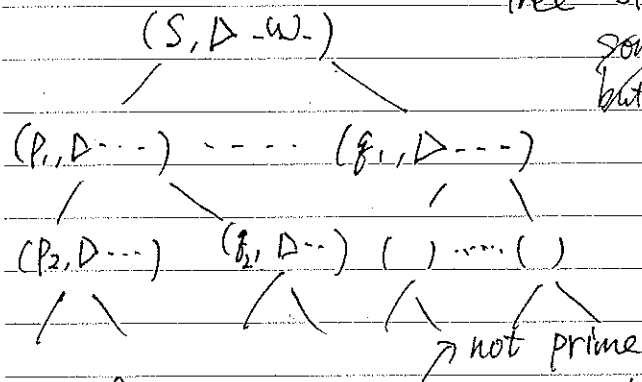
$$\delta: \Delta \subseteq ((K-H) \times \Sigma) \times (K \times (\Sigma \cup \{\leftarrow, \rightarrow\}))$$

$$(p, a) \rightarrow (q_1, b_1)$$

$$(p, a) \rightarrow (q_2, b_2)$$

computation with NTM

Tree structure.



some of the paths, never stops  
but one of them it halts  
decides  
semidecides - { yes halt  
no never stop

$$L = \{I^m : m \text{ is a composite number}\}$$

NTM decides L

$$I * \Delta \underbrace{I \dots I}_m \#$$

2\* Nondeterministically Choose  $1 < p, q < m$

$$\Delta \underbrace{I \dots I}_m \# \underbrace{I \dots I}_p \# \underbrace{I \dots I}_q$$

2.2 check if  $p \times q = m$



2.2 check if  $p \times q = m$   
 if yes halt on y  
 if no halt on n

Theorem 4: If NTM  $M$  decides  $L$ , then exists DTM  $M'$  that decides  $L$ .

Proof: Sketch (Different with Nodes)

\* Rules of  $M$   $r_1, r_2, \dots, r_k$

\*  $\{r_1, r_2, \dots, r_k\}^+$  sequence of rule applications  $r_2((p_2, a_2), (q_2, b_2))$

$x = 231$ : step 1: apply rule 2

(2)

$r_3$

(3):

$r_1$

\* might not be feasible

\* Simulate  $M$  Using 3-tape Turing Machines:

\* Tape 1: Keep the input  $w$

\* Tape 3: Enumerate  $\{1, 2, \dots, k\}^+$  in dictionary order

First all length 1 string

Then all length 2 string

\* Tape 2: simulate computation by  $M$ , according to  $x$  on tape 3;

\* Infeasible: next  $x$

\* Doesn't halt: next  $x$

\* halts on no: next  $x$

\* halts on y:  $M'$  halts on yes.

(\* similar to BFS (Breadth-first-search) \*)

If all  $x$ 's of some length considered,

All feasible computations by  $M$  halts on  $n$ .

$M'$  halts on  $n$ ;

function  
 $\delta, \Delta$   
 relation  
 $(p, a), (q, b)$

go down the path on tape

Q

Example: DTM:

1.  $\triangleright I \dots I$

1.  $\triangleright \underbrace{I \dots I}_m$

2. For each  $I \leq p, q \leq m$

2.1  $\triangleright \underbrace{I \dots I}_m \# \underbrace{I \dots I}_p \# \underbrace{I \dots I}_q$

2.2 If  $p \times q = m$ , halts on  $y$

3. Halts on  $N$

\* depth first search

\* one step for each branch in turn.

## § Lecture 17

CFL. close under

\* union concatenation Kleene star

not closed under

\* complementation, intersection

$$L = \{a^n b^n c^n\}$$

Not C.F.

For recursive Langs. R.L.

$$\bar{L} = \overline{L(a^* b^* c^*)}$$

$$\cup \{a^n b^m c^k, n \neq m\}$$

$$\cup \{a^n b^m c^k, m \neq k\}$$

$\bar{L}$  C.F.

but  $\bar{L}$  is not

1.  $L$  is r.L.

TM  $M$  decides  $L$

$w \in L$ ,  $M$  halts on  $y$

$w \notin L$ ,  $M$  halts on  $n$

$M'$ : same as  $M$ , except swap  $y, n$ :

$M'$  decides  $\bar{L}$

$w \in \bar{L}$ ,  $w \notin L$ ,  $M'$  halts on  $y$

$w \notin \bar{L}$ ,  $w \in L$ ,  $M'$  halts on  $n$

## Proof of 2:

\*  $L_1, L_2$  are r.l.

\*  $M_i$  decides  $L_i$  ( $i=1,2$ )

\*  $M$ : 2-tape TM

1. copy input  $w$  to Tape 2

2. simulate  $M_1$  on Tape 1

$M_1$  halts on  $\begin{cases} y, & M \text{ halts on } y \\ n, & \text{goto } 3 \end{cases}$

3. Simulate  $M_2$  on tape 2:

$M_2$  ~~halts~~ halt on  $\begin{cases} y, & M \text{ halts on } y \\ n, & M \text{ halts on } n \end{cases}$

$M$  decides  $L_1 \cup L_2$

Tape 1:  $\vdash \square \vdash w \vdash$

Tape 2:  $\vdash w \vdash w \vdash$

$M_1$  halts on  $y$  at 2

$M$  halts on  $y$

$w \in L_1 \cup L_2 \Rightarrow$

$\begin{cases} w \in L_1 \end{cases}$

$\begin{cases} w \in L_2 \end{cases}$

$(w \notin L_1)$

$M_2$  halts on  $y$  at 3

$M$  halts on  $y$

$w \notin L_1 \cup L_2$

$w \notin L_1$ ,  $M_1$  halts on  $n$

$w \notin L_2$ ,  $M_2$  halts on  $n$

$M$  halts on  $n$

Proof:  $L_1 \cap L_2$  is r.l.

# § Lecture 4/10

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TM is deterministic

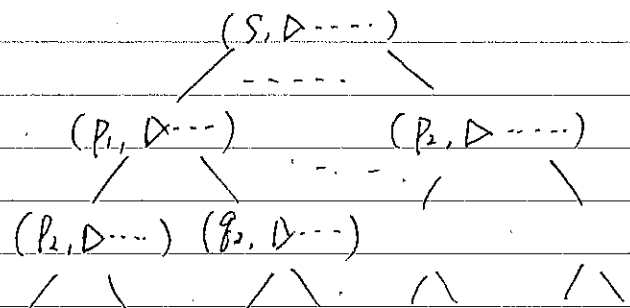
\* Derivation is sequence

$$(s, \triangleright ab \dots) \vdash (p_1, \triangleright \dots) \vdash (p_2, \triangleright \dots) \dots$$

NTM

\* Derivation is a tree

Math. Def.



Depth of tree: 1000

NTM solves problem in 1000 steps

TM: (sequential machine)  $2^{1000}$  steps

NP  $\neq$  P

## Lecture 17. Closure Properties

$L_1, L_2$  recursive

$i=1,2, M_i$

$w \in L_i \quad M_i \text{ halts on } y$

$w \notin L_i \quad M_i \text{ halts on } n$

$L_1 \cap L_2, L_1 \cup L_2$  recursive

$M$ :

Tape 1:  $\triangleright \sqcup x$ , simulate  $M_1$

Tape 2:  $\triangleright \sqcup x$ , simulate  $M_2$

$M$  halts on  $y$

iff both  $M_1$  &  $M_2$  halts on  $y$

$M$  decides  $M_1, L_1 \cap L_2$

$M$

on  $y$

iff either  $M_1$  or  $M_2$  h on  $y$

$M$  decides  $L_1 \cup L_2$

$L_1, L_2$  recursive

$M$ : \* Nondeterministically split  $w = x, y$   
move  $y$  to Tape 2

Tape 1:  $\triangleright \sqcup x$  simulate  $M_1$ , if halts  $y$

Tape 2:  $\triangleright \sqcup y$   $\hookrightarrow$  simulate  $M_2$ , if halts  $y$

$M$  halts on  $y$

$M$  decides  $L_1, L_2$

proved.

$L_1^*$  is recursive.

$M$ : \* Nondeterministically run subroutine 1 or subroutine 2

\* subroutine 1:

Simulate  $M_1$  on tape 1

\* subroutine 2:

N-split  $w = xy$ , move  $y$  to tape 2

Tape 1:  $\triangleright \sqcup x$  simulate  $M_1$

Tape 2:  $\triangleright \sqcup y$  Move  $y$  to Tape 1,  
goto ①

Note: recursive languages closed under complementation

\*  $L$  is recursive

\*  $M$  decides  $L$

construct  $M'$  same as  $M$  except swap the  $Y$  &  $N$

Why this idea doesn't work for recursive enumerable language.

\*  $L$  is r.e.  $L$ .

\*  $M$  semi-decides  $L$

$w \in L$   $M$  halts

$w \notin L$   $M$  does not halt

Why wrong?

No.

Date

$w \in L$ ,  $M$  halts,  $M'$  does not halt

$w \notin L$ ,  $M$  does not halt,  $M'$  halts

$M'$  decides  ~~$L$~~   $\bar{L}$

\*  $M'$  can't know if  $M$  does not halt.

To construct  $M'$ , we need to have a way to decide the following whether  $M$  halts on  $w$ ?

Halting Problem. unsolvable

Lecture 18

ATM: an algorithm for solving particular problem (program you write)

Universal TM: "computer" that can run various algorithms.

\* Input: TM  $M$ , data  $w$

\* Do: Simulate  $M$  on  $w$

prolog; C

Questions:

\* How to encode TM & data in uniform way

\* How to simulate

Example:

$(s, \triangleright aa \sqcup) \vdash (q, \triangleright \sqcup a \sqcup) \vdash (s, \triangleright \sqcup a \sqcup) \vdash (q, \triangleright \sqcup \sqcup \sqcup) \vdash (h, \triangleright \sqcup \sqcup \sqcup)$

10 states (suppose) encode the states; the symbols

$S - q0000$

$P_1 - q0001$

$P_2 - q0010$

$P_3 - q1000$

$P_4 - q1001$

$y, n \}$  halting state

the input; encode aa<sub>L</sub>

Tape1:  $\triangleright \_ a100 a100 a000$

Tape2:  $\triangleright \_ \underbrace{g00 a100 g01 a000}_{r1} \underbrace{g00 a000 g10 a00}_{r2}$

-----  $\underbrace{g01, a001, g01 a011}_{r5}$  (rules)

Tape3:  $\triangleright \_ g00$   
(initial state)

scan Tape 2

step1:

Tape1:  $\triangleright \_ a000 a100 a000$

Tape3: ~~g01~~  $\triangleright \_ g01$

step2:

Tape1:  $\triangleright \_ a000 a100 a000$

Tape3:  $\triangleright \_ g00$

Step3:

Tape1:  $\triangleright \_ a000 a000 a000$

Tape3:  $\triangleright \_ g01$

Step4:

Tape1:  $\triangleright \_ a000 a000 a000$

Tape3:  $\triangleright \_ g00$

Steps:

Tape1:  $\triangleright \_ a000 a000 a000$

Tape3:  $\triangleright \_ g10$

→ halt (don't have any outgoing transactions.)

\* TM  $M$  operates on string

\* Encoding of  $M$ , ' $M$ ' is a string

\*  $M$  can operate on ' $M$ '

\*  $L = \{ 'M' : M \text{ is TM with certain property} \}$

Language                      { Problems: }

§ 4/15

19 - The halting Problem

$L$  recursive :  $\exists$  TM,  $M$  decides  $L$   
 $w \in L$ ,  $M$  halt on  $w$  on  $y$   
 $w \notin L$ ,  $M$  halt on  $w$  on  $n$

closed under complementation,  $\bar{L}$

$L$  recursively enumerable,  $M$  semi-decides  $L$ , ~~not~~  
 $w \in L$ ,  $M$  halt on  $w$  on  $y$   
 $w \notin L$ ,  $M \nearrow$

not closed under complementation:

Universal TM. \* " $M$ " " $w$ "

\* simulate  $M$  on  $w$

\* TM  $M$  operates on string  $w$

\*  $M$  can operate " $M$ "

\*  $L = \{ 'M' : M \text{ with property} \}$

\* Deciding " $M$ "  $\in L \Leftrightarrow$

Deciding ~~if~~ if  $M$  has the property



$\overline{H_0} = \{ "M" : M \text{ does not halt on } "M" \}$  inverse of the diagonal element

Lemma 1:  $\overline{H_0}$  is not r.e. (recursively enumerable)

Proof: Suppose  $\overline{H_0}$  is r.e. ( $"M^*" is the encoding)$

\* Exist  $M^*$  s.t.  $\begin{cases} w \in \overline{H_0}, M^* \text{ halts on } w & \textcircled{1} \\ w \notin \overline{H_0}, M^* \text{ does not halt} & \textcircled{2} \end{cases}$

\*  $"M^*" \in \overline{H_0}$

\* by definition of  $\overline{H_0}$ ;  $M^*$  doesn't halt on  $"M^*",$

\*  $M^*$  does not halt on a word of  $\overline{H_0}$ , contradicts with  $\textcircled{1}$

\*  $"M^*" \notin \overline{H_0}$

\* coz of  $\textcircled{2}$ ,  $M^*$  doesn't halt on  $"M^*",$

\* by definition of  $\overline{H_0}$ ,  $"M^*" \in \overline{H_0}$ .

contradiction:

Diagonalization principle

$S = \{ p : p \text{ doesn't cut own hair} \}$

Exist a person who <sup>only</sup> cuts the hair of anyone who does not <sup>p\*</sup> rule cut own hair.

$p^* \in S$ : By def of  $S$ ,  $p^*$  doesn't cut ~~his~~ own hair  
by rule,  $p^*$  cut his own hair

$p^* \notin S$  By def of  $S$ ,  $p^*$  cut his own hair.  
By rule, he shouldn't cut his own hair.

$$\overline{H_1} = \overline{H_0} \cup \{w: w \text{ is not encoding of TM}\}$$

Theorem 1:  $\overline{H_1}$  is not r.e. (recursively enumerable)

Complement of  $\overline{H_1}$ ?

$$\{w: w \text{ is encoding of TM } M; M \text{ halts on "M"}\}$$

$$H_1 = \{ "M"; M \text{ halts on the "M"} \}$$

Lemma 2:

Theorem 2:  $H_1$  is not recursive

Proof: Suppose  $H_1$  is recursive, then  $\overline{H_1}$  is recursive  
then  $\overline{H_1}$  is r.e.

contradicts with theorem 1

$$H = \{ "M" "w": M \text{ halts on } w \}$$

Halting Problem

Does  $M$  halts on  $w$ ?

$$\Leftrightarrow "M" "w" \in H?$$

Theorem 2:  $H$  is not recursive. The halting Problem is undecidable

$H$  is recursive

Exist  $M^*$ :

$$"M" "w" \in H, M^* \text{ halts on } y$$

$$"M" "w" \notin H, M^* \text{ halts on } n$$

/\*

\* Decidable worst

\* NP-complete bad

\* P good

\* n

\* log n

\*/

Proof: suppose  $H$  is recursive,

TM  $M_H$  decides  $H$

$M_H$ : method to decide if a turing machine  $M$  halts on  $w$

\* show: can design a method to decide  
if  $M$  halts on " $M$ " Contradiction with Lemma 2

$M_H$  (Method)

\* Input  $X$

\* Run  $M_H$  on  $X$

$M_H$  halts on  $y$

\*  $X$  is encoding of TM,  $M$

\*  $M$  halts on " $M$ "

$M_H$  halts on  $n$

\*  $X$  is encoding of TM,  $M$

\* but  $M$  not halt on itself " $M$ "

OR  $X$  is not an encoding of TM  $M$

$M_H$  decides  $H$  contradiction with Lemma 2.

$A \Rightarrow B$  \* soln for  $B$  can be used for  $A$

\* if  $A$  not solvable conclude  $B$  not solvable

To prove  $B$  is unsolvable

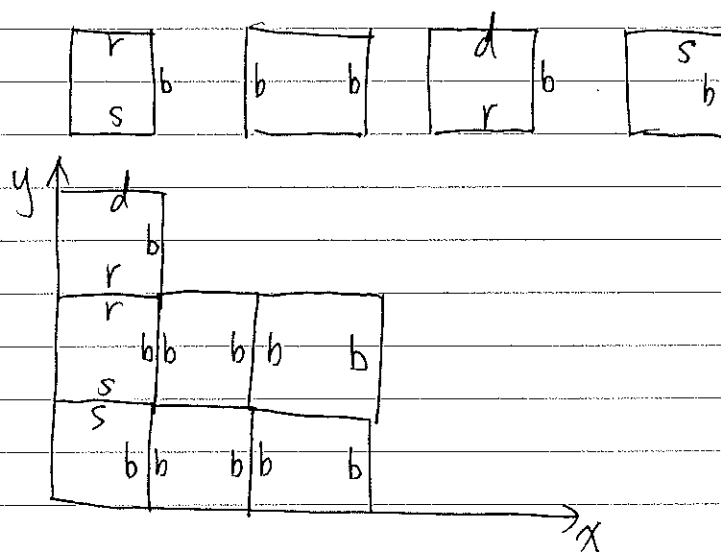
\* Find  $A$

①  $A$  is known to be unsolvable

②  $A$  can be reduced to  $B$

$A \Rightarrow B$

# TILING Problem:



recap:

Lecture 4/17

$$\overline{H_0} = \{ "M", M \text{ not halt on "M"} \} \quad \star$$

undecidable

is not r.e.

$$\overline{H_1} = \overline{H_0} \cup \{ w, w \text{ is not encoding of TM} \}$$

is not r.e.

$$H_1 = \{ "M"; M \text{ halts on "M"} \}$$

is not recursive

$$H = \{ "M" w, M \text{ halts on } w \}$$

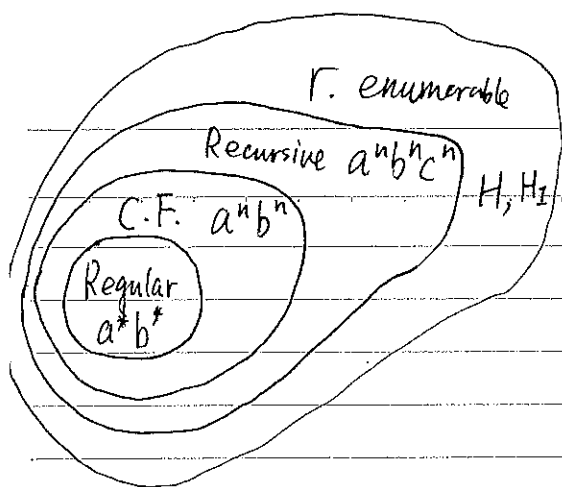
is not recursive

undecidable  $\star$

halting problem is undecidable

Regular

$a^*b^*$



non-r.e.

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$H$  is r.e.

UTM semi-decides  $H$

$X = "M" w H X$

Run UTM on  $w$ , Simulate  $M$  on  $w$  halt

$X \notin H$   $\left\{ \begin{array}{l} X \text{ is not encoding of TM} \\ X = "M", M \text{ does not halt on } w \end{array} \right\}$  not halt

$\bar{H}$ .

Assume  $\bar{H}_0$  is r.e.

Exist  $M^*$   $\left\{ \begin{array}{l} w \in \bar{H}_0 \quad M^* \text{ halts on } w \quad (1) \\ w \notin \bar{H}_0 \quad M^* \text{ not halt } w \quad (2) \end{array} \right.$

the encoding of this lang.

" $M^*$ "  $\in \bar{H}_0$ .  $M^*$  not halt on " $M^*$ " (by def. of  $\bar{H}_0$ )  
contradicts (1)

" $M^*$ "  $\notin \bar{H}_0$ . By (2)  $M^*$  not halt on " $M^*$ "  
contradicts def. of  $\bar{H}_0$

§ Lecture 20

Theorem 2:

$K_1 = \{ "M" : \text{Turing machine } M \text{ halts on an empty tape} \}$  is not recursive.

Proof: \* suppose  $K_1$  is recursive

\* Exist TM  $M_{K_1}$ :

$w \in K_1$   $M_{K_1}$  halts at  $y$

$w \notin K_1$   $M_{K_1}$  halts on  $n$

\*  $M_k$ : A method to decide if a TM halts on empty tape at  $y$

② a TM halts on empty tape at  $y$

\* show: can design method to decide if

① a TM  $M$  halts on  $w$

Contradiction:  $\Rightarrow k$ , not recursive.

Q:  $B \Rightarrow A$ ?

Need TM that starts from empty tape & related to  $A$

Design  $M_w$ : Simulate  $M$  on  $w$

from empty tape

Method for  $A$  ( $M_H$ )

\* Input:  $M, w$

\* Build  $M_w$

\* Run  $M_k$  on " $M_w$ "

$$\begin{cases} y & M_w \text{ halts on empty tape} \\ & M \text{ halts on } w \\ n & M_w \text{ Not halts on empty tape} \\ & M \text{ not halts on } w \end{cases}$$

$M_H$  decides  $H$ ,

$$\begin{cases} w \in H & M_H \text{ halts at } y \\ w \notin H & M_H \text{ halts at } n \end{cases}$$

Theorem 3:  $K_2 = \{ \langle M \rangle : \text{Turing Machine } M \text{ halts on every input string} \}$   
is not recursive

Proof: \* suppose  $K_2$  recursive

\* exist  $M_{K_2}$

$$\begin{cases} w \in K_2 & M_{K_2} \text{ halts at } y \\ w \notin K_2 & M_{K_2} \text{ halts at } n \end{cases}$$

③ Decides if a TM halts on every input

\* show: Can design method ( $M_{K_2}$ ) for solve

① if a TM  $M$  halts on empty Tape, contradiction:

③  $\Rightarrow$  ① Define TM

$M^*$ : \* Erase the input

\* simulate  $M$  on empty Tape

Method:

$M_{K_2}$  (Method for A)

\* Input: " $M$ "

① Build  $M^*$

② Run  $M_{K_2}$  on " $M^*$ "

$$\begin{cases} y & M^* \text{ halt on every input} \\ & \Leftrightarrow M \text{ halts on empty tape} \\ n & \text{not halt on some input} \\ & \Leftrightarrow M \text{ not halt on empty } \text{ ~~any~~ tape} \end{cases}$$

Theorem 4:

$K'_2 = \overline{K_2}$  closure property

Proof: Suppose  $K_4$  is recursive

Exist a TM  $M_{K_4}$

$w \in K_4$ ,  $M_{K_4}$  halts at y

$w \notin K_4$ ,  $M_{K_4}$  halts at no

(B) decide if two turing machines halt same inputs

Design  $M^*$ : halts on every input

Method for  $M_{K_2}$ :

input: "M"

① Run  $M_{K_4}$  on "M" "M"

$\begin{cases} y & \text{halts on every input} \\ n \end{cases}$

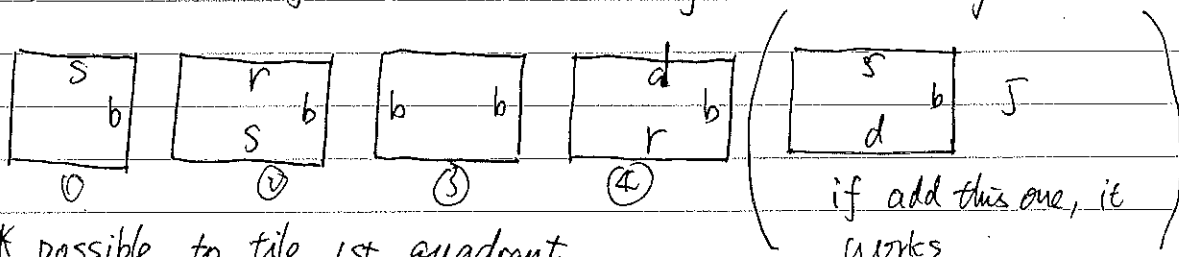


$M_5$  can actually decide if  $M$  halts on  $e$ .

### Piling Problem:

Bounded Tiling is First MPC Problem

\*  $D$ : Collection of tiles with marking on some edges

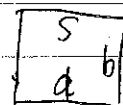
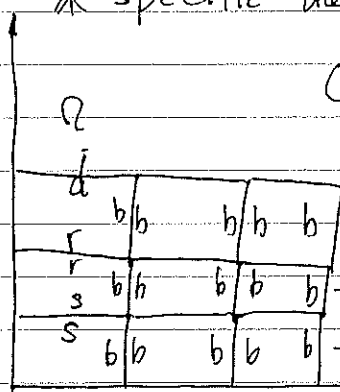


\* possible to tile 1st quadrant

\* neighbors share same marking

\* specific tile at origin

Can't tiling the whole quadrant



$$H = \{(1, 3), (2, 3)$$

$$(4, 3), (2), (3, 3) \dots$$

$$V = \{(1, 2), (2, 4) \dots$$

Formal def.

\*  $D$ , tiles  $d_0 \in D$

\*  $H, V \subseteq D \times D$  Horizontal/vertical Constraints

\* Tiling:  $f: \mathbb{N} \times \mathbb{N} \rightarrow D$

$$f(0, 0) = d_0$$

$$(f(m, n), f(m+1, n)) \in H$$

$$(f(m, n), f(m, n+1)) \in V$$

## Lecture Apr. 22

Reduce problem A to problem B

\* Soln for B can be used to solve A

\* If A is undecidable, B is undecidable

M halts "M"? (Diagonalization)

H: M halts on w?

$H_n$ : M fails to halt on w

M halts on e?

M halts on all input?  
(some)

$L(M)$  regular?

Tiling

$L(M) = \{w: M \text{ halts on } w\}$

Proof of ⑤  $L(M)$  is regular

\* Suppose it is decidable

\* Exist TM  $M_s$  (method) to (B)

decide if language semidecided by a TM is regular?

\* Show: Exist method to (A) decide

if a TM  $(M)$  halts on e

UTM:

\* "M" "w"

\* Simulate M on w

Define  $M^*$

\* keep input X

\* Run M on empty tape

\* Run UTM on X

$L(M^*) = \begin{cases} \emptyset & \text{M fails to halt} \\ \{ "M", "w", \dots \} & \text{M halts on e} \end{cases}$

regular

M halts on e

not regular

undecidable

Tiling Problem:\* Given  $D, d_0, H, U$ 

\* Exist tiling?

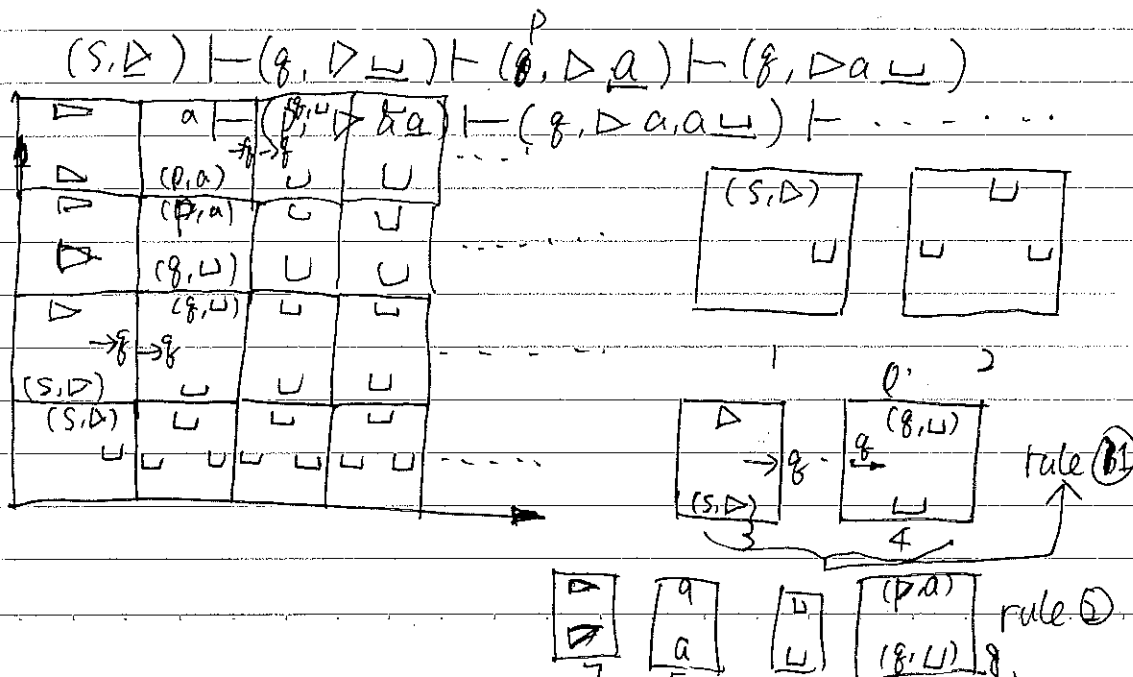
Theorem: Tiling problem is undecidableProof: Reduce  $H_n$  to  $T$ \*  $H_n$ : if  $M$  fails to halt on  $e$ \* create tiling system to simulate computation by  $M$ 

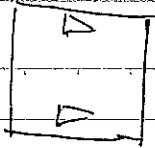
\* 1st row: Initial Conf.

\* 2nd row: conf. after 1st derivation

 $M$  fails to halt  $\equiv$  Exist Tiling

example

 $M: \delta(s, \Delta) = (q, \rightarrow) \quad (1)$  $\delta(q, \sqcup) = (p, a) \quad (2)$  $\delta(p, a) = (q, \rightarrow) \quad (3)$ 



Rules 3:

$\triangleright$	$a$	$(p, a)$	$\sqcup$
$\triangleright$	$a$	$(f, \sqcup)$	$\sqcup$
$\triangleright$	$a$	$(f, \sqcup)$	$\sqcup$
$\triangleright$	$(p, a)$	$\sqcup$	$\sqcup$

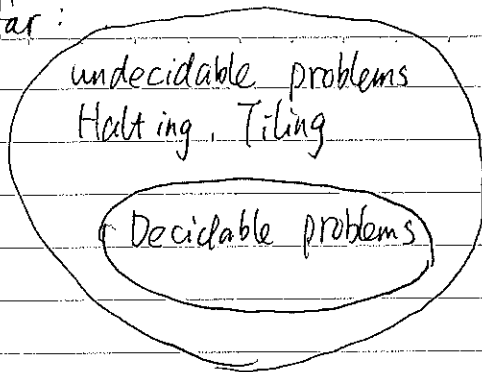
polynomial Time reduction

# Lecture Apr. 24

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So far:



P: problems solvable by TM  
in poly-time.

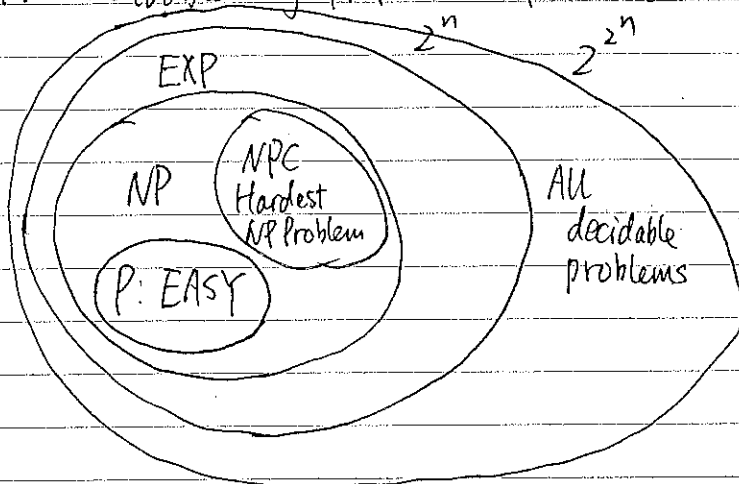
$$P \subseteq NP$$

$$NP \subseteq P?$$

$$P \neq NP$$

NP: solvable by NTM in polytime

EXP: Solvable by TM in exponential time



$$NPC = NP \text{ complete}$$

TM is polynomially bounded if for any input  $x$ , any configuration  $C$

$$(S, D \sqsubseteq x) \vdash^T C \quad T: \# \text{ of steps}$$

$$T \leq P(|x|) \quad |x|: \text{Input Size}$$

$P()$ : polynomial

Example:

(1) \* Determine if DFA  $M$  accept  $w$

\* Time =  $|w|$

polynomial

(2) \* Determine if  $n$  is prime

for ( $i=0$ ;  $i < \frac{n}{2}$ ,  $i++$ )

if ( $n \bmod i == 0$ )

return no;

return, yes

Integer

input size

$$S = \log_2 n$$

~~$A = \emptyset$~~

not in this course

Running time interms of value of

\* Here: Running time interems of size of  $n$

\* Time  $O(n) = O(2^S)$

Cryptography:  $n$  300 digits

1,000,000,000

NPC Problems

\* Large class of problems, no poly-time algorithm found

\* proved: If one NPC Problem solvable in poly-time  
ALL NPC problems solvable in poly-time

\* Belief: NPC problem can't be solved in poly-time.

\* you: Show your problem is NPC

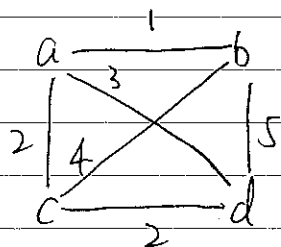
Class  $P = \{L : L \text{ decidable by TM in poly-time}\}$   
 $L \subseteq \Sigma^*$

$w \in \Sigma^*$   $w \in L$ ?

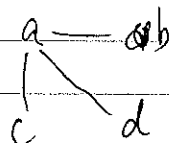
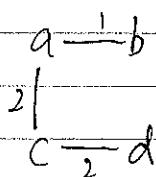
Can be answered in  $p(|w|)$  time

Optimization: problem: optimize objective function eg. MST

Decision Problems: yes or no



spanning trees:



$G$  has spanning tree has weight  $\leq 6$  ? yes Decision version

$\leq 3$  ? no

Input size of  $G$   $|V|+|E|$

$DST = \{ \langle G, k \rangle : G \text{ has spanning tree of weight } \leq k \}$

$DST \in P$  ?

Knapsack  $\in P$  ?  
Time  $O(nW)$

$f(S)$

size of bag

$$\text{Input Size: } S = \log_2 W + \sum_{i=1}^n \log_2 w_i + \sum_{i=1}^n \log_2 v_i$$

$n$  prime

$O(n)$   $O(2^5)$

Closure Property of  $P$

$L_1, L_2 \in P \Rightarrow L_1 \cap L_2 \in P$

Proof:  $x \in L_i$ , decided by  $M_i$  (TM) in  $O(|x|^{c_i})$  ( $i=1,2$ )

construct  $M$  for deciding if  $x \in L_1 \cap L_2$

Tape 1:  $\Delta \sqcup x$  simulate  $M_1$  }  $M$  halts  $\iff$   
 $M_1 \& M_2$  halt on  $y$

Tape 2:  $\Delta \sqcup x$  simulate  $M_2$

Running Time of  $M$ :  $O(|x_1|^{c_1} + |x_2|^{c_2}) = O(|x|^{c_1+c_2})$

NP.

No.

\* NTM is poly-bounded if for any input  $x$ , any configuration  $C$

$$(S, \Delta \sqcup x) \vdash^T C$$

$T \leq p(|x|)$ ,  $p()$  is polynomial

\* No branch takes more than poly-time

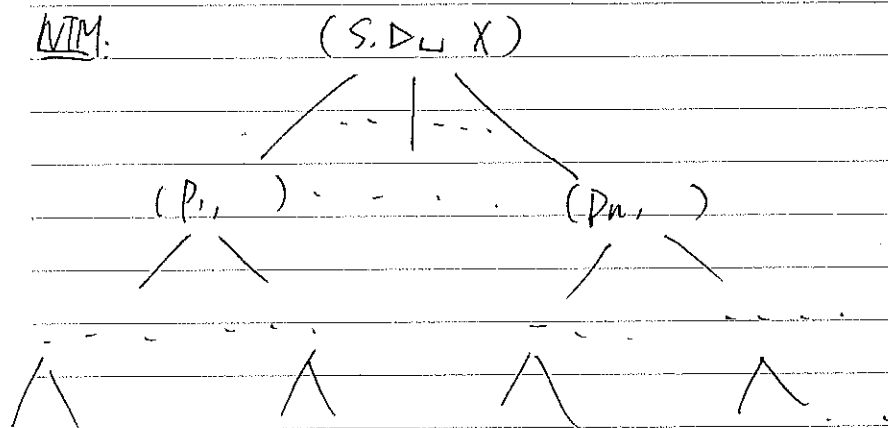
\* each branch takes poly-time

All branches might takes more than poly-time

TM.

$$(S, \Delta \sqcup x) \vdash \dots \vdash \dots \vdash \dots \vdash \dots$$

NTM.



\*  $P \subseteq NP$

Example: (COMPOSITE)

\* Is  $x$  a composite number?

NTM:

\* Nondeterministically choose  $(m, n)$

\* Test:  $m \cdot n = x$ ?

return y/N

TM: for  $(i=1, i < \sqrt{x/2}; i++)$

if  $x \bmod i == 0$

return yes

return no;

Exponential

	Size
$m \ 1011$	4
$n \ x \ 101$	3
$\hline 1011$	
0000	3x4
$\hline 1011$	<del>0000</del>
	$O(n m )$



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Date

§ 4/29

$$P \equiv \{L, L \text{ decidable in } p\text{-time by } \underline{\underline{TM}}\}$$

Determine "WEL?" in time  $P(|w|)$

$$NP = \{L \text{ decidable in } P\text{-time by } \underline{\underline{NTM}}\}$$

$$P \subseteq NP$$

Is  $x$  composite?

\* Non-deterministically choose  $m, n$

\* Check  $mn = x$ ?

$$\begin{array}{c} \leq P \\ \downarrow \\ \text{decidable} \\ \text{NTM} \end{array}$$

$\left\{ \begin{array}{l} \text{yes} \rightarrow \text{return yes} \\ \text{no} \end{array} \right.$

231 yes

61 ~~yes~~ no

return no.

$x \in L$   $x$  is a yes-input

$x \notin L$   $x$  is a no-input

is Composite

$x=231$  yes input

Certificates  $\left\{ \begin{array}{ll} m=3, & n=77 \\ m=7 & n=33 \\ m=11 & n=21 \end{array} \right.$

~~$x=61$~~

~~$x=61$~~

\* certificate: for yes-input

\* sth. allows to verify  $x$  is indeed yes-input

\* Verification:

Input:  $x$ , certificate

Do: verify  $x$  is yes-input

If certificate verification takes  $p$ -time, then problem  $\in NP$

- \* Nondeterministically pick certificate
- \* verify.

To show problem  $\in NP$

\* Find certificate

\* prove verification takes  $p$ -time

D Subset Sum  $\in NP$

$\{1, 2, 3, \dots, 10\}$

$C=20$

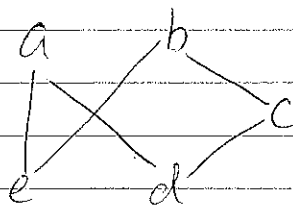
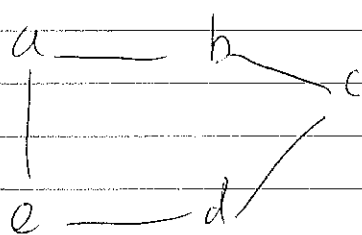
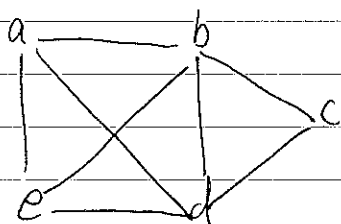
$10+5+4+1 = \text{yes}$

give a subset I'll add  
verification: take sum  
poly-time

$C=100$

no

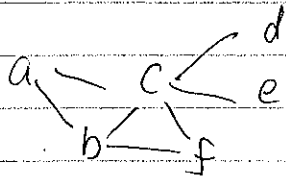
D Hamiltonian Cycle



Size of graph  $S = |V| + |E|$

checking very easy

\* Vertex cover.



$\{b, c\}$  V.C.

give a set of vertices as certificate  
easy to verify

P: closed under all operations

NP: complement?

$L \in NP$

$\bar{L} \in NP?$

Satisfiability:

$$x \rightarrow y \equiv \neg x \vee y$$

basic three:

$\bar{x}$  not

$x \vee y$  or

$x \wedge y$  and

$$f(x, y) = (x \vee \bar{y}) \wedge (\bar{x} \vee y)$$

Truth assignment

$x$	$y$	$f$
0	0	1 ← $f$ is satisfiable
1	0	0
0	1	0
1	1	1 ←

$$g(x) = \bar{x} \wedge x \text{ Not satisfiable}$$

Conjunction  $\wedge$

Disjunction  $\vee$

# SAT $\in$ NP

Terms:

Literals:  $x, \bar{y}$  (var (boolean) or negation of var)

clauses: Disjunction of literals

conjunctive Normal Form: conjunction of clauses

C.N.F

All Boolean formulae can be transformed into CNF

K-CNF Formula in CNF where each clause has  $k$  or fewer ~~literal~~ literals

3-SAT  $\in$  NP    2-SAT  $\in$  P

§ Lecture 22:

Reduction from problem A to problem B

\* soln for B can be used to solve A

\* If A is undecidable, then B undecidable.

\*  $L_1, L_2 \subseteq \Sigma^*$

\*  $f: \Sigma^* \rightarrow \Sigma^*$

-  $x \in L_1 \iff f(x) \in L_2$

-  $f(x)$  computed in  $p(|x|)$  time

$f$  is called a poly-time reduction from  $L_1$  to  $L_2$

If such that  $f$  exist,  $L_1 \leq_p L_2$ , // suppose algorithm  $A_2$

\* for deciding  $y \in L_2$

\* in  $p(|y|)$  time,

Algorithm A: decides if  $x \in L_1$

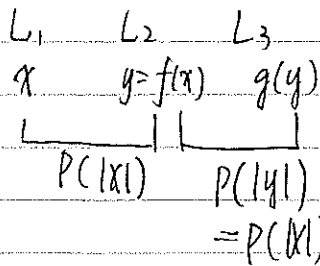
①  $y = f(x)$

$p(|x|)$

$|y| = p(|x|)$

② Run  $A_2$  on  $y$

$p(|x|) = \text{polynomial of } |x|$



NP-complete (NPC)

$NPC \subseteq NP$

$L$  is NPC if

\*  $L \in NP$

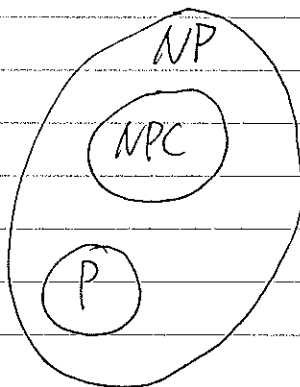
$\forall L' \in NP, L' \leq_p L$

If  $L$  ~~decide~~ decidable in p-time

all NP-problems solvable in p-time

$P \equiv NP$

$NPC \subseteq NP$



$$\left\{ \begin{array}{l} P \cap NPC \neq \emptyset \\ \exists L \in NPC, L \in P \Rightarrow NP = P \text{ (believed false)} \\ \Rightarrow NP \neq P \end{array} \right.$$

$$\left\{ \begin{array}{l} P \cap NPC = \emptyset \\ \vee \end{array} \right.$$

First NPC Problem

Bounded Tiling

↓  
SAT (Cook's Theorem)↓  
3-SAT↓  
Clique↓  
Independent Set↓  
Vertex coverKnown: SAT  $\in$  NPCshow: 3-SAT  $\in$  NPCIdea prove SAT  $\leq_p$  3-SAT $\phi$  CNF formula where some clauses have  $> 3$  literals

$$\phi: x_1 \wedge \underbrace{(x_2 \vee \bar{x}_3 \vee \bar{x}_4)}_a \wedge \underbrace{(x_5 \vee x_6)}_b \equiv \overset{1,1}{(x_2 \vee \bar{x}_3 \vee y_1) \wedge (y_1 \vee \bar{x}_4 \vee x_5 \vee x_6)}$$

$$\overset{1,1}{\wedge (\bar{x}_2 \vee \bar{x}_3 \vee y_1) \wedge (y_1 \vee \bar{x}_4 \vee y_2) \wedge (\bar{y}_2 \vee x_5 \vee x_6)}$$

 $f(\phi) \neq$  3-CNF $\phi$  is satisfiable  $\Leftrightarrow f(\phi)$  is satisfiable

A general fact

$$a \vee b \text{ satisfiable} \Leftrightarrow (a \vee y) \wedge (\bar{y} \vee b)$$

LHS true iff  
either a or b  
true.

Satisfiable:

RHS true

 $y=1$  b trueor  
 $y=0$  a true