

Mathematical Theory of Computation

Muralikrishnan Sr

- Obj: To mathematically model what an alg. is.

→ Turing Machine Model - Alan Turing

→ λ calculus - Alonzo Church

→ Combinatorics

→ Term rewriting System - Emil Post

→ Recursive fn Model - Kurt Gödel

→ Grammatical Structures - Noam Chomsky

↑
1940 (around)

Church-Turing Thesis

Turing m/c is the standard model of reference for Algorithmic Computability

(Just like carnot engine is an ideal engine for comparison)

It formalises the notion of algorithmic computation.

→ What is mathematical formln of a problem ??

- Limit problem to Y/N problem OR Decision Problems

Problem: Given a no: N, check whether N is prime or not ??

⇒ Def: An Alphabet is a finite set of symbols. eg: ASCII, Binary {0,1}, Decimal {0,9}

⇒ A word / string over Σ is a finite sequence of symbols from Σ .

eg 0110 → dec. string , abcca → ASCII

Given 'n' → given a finite string over some fixed alphabet Σ .

⇒ Def: A language over alphabet Σ is any collection (subset) of strings over Σ .

⇒ Σ^* : Set of all strings over Σ .

eg $\Sigma = \{0,1\}$ $\Sigma^* = \{\epsilon, 00, 01, 10, 11, 000, 001, \dots\}$

i.e A language L over Σ is any subset of Σ^*
or subset of Σ^*

ϵ - null string

- identity

when concatenated with
any strg gives the same.

⇒ Set of language is uncountably infinite.

⇒ Any decision problem can be modelled as a language over some finite alphabets

$\Sigma = \{0,1\}$ Parity = $\{0, 0^i, i \geq 0, 1^j, j \geq 0, \dots\}$
= All string with even 1s.

(Q) Decision Problems \Leftrightarrow Language recognition problems.

Modelled as: Given language L over Σ and a string $x \in \Sigma^*$

To determine if $x \in L$??

a) Set of all binary strings Given $x \in \{0,1\}^*$. Is $x \in \text{PARITY}$

(Decision problem - strings that map to 0 or 1)

Yes/No

A computational problem is a function which maps from string to string.

$$f: \{0,1\}^* \mapsto \{0,1\}^*$$
$$x \mapsto f(x)$$

A computational solution to f is an algorithm A.
such that an i/p $x \in \{0,1\}^*$ A satisfies :-
a) A terminates in finite # of steps
b) The o/p $A(x) = f(x)$

Finite State Machine: finite no. of states, potentially ∞ memory.

H/W prgm segments - read/store

- if -
- goto

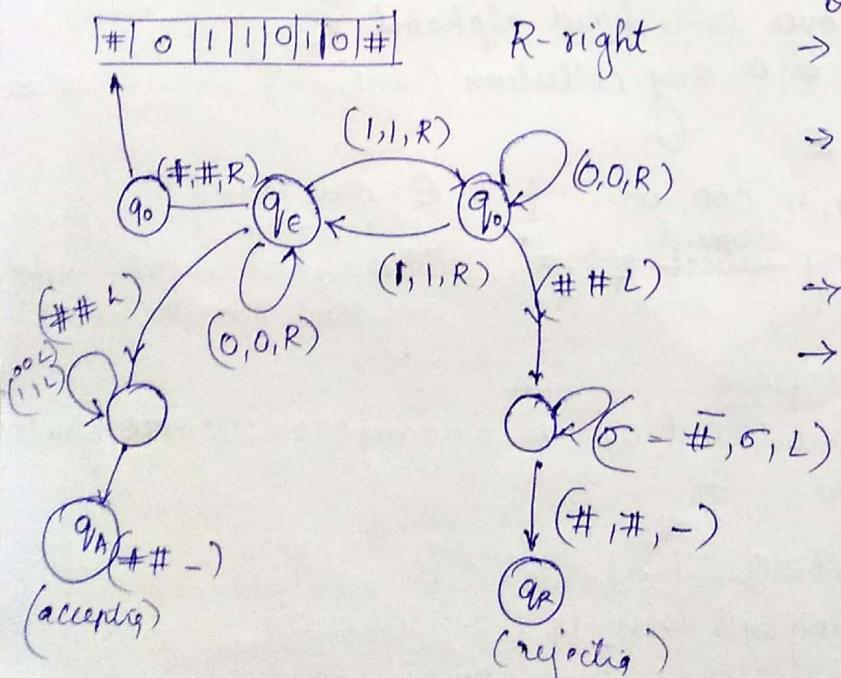
* F.S.M has read only memory

Turing machine : Any machine : finite state, ∞ memory

* Requirements for a General Purpose Computing System :-

- finite states, Test & jump transition s/m
(memory)
- An unrestricted amnt of read-write memory.

Finite State Machine for PARITY



At each step the m/c
→ reads from input pointed (Tape Head)
→ write back to the tape
(Not possible for ESM)
→ Move the head left/right (optional)
→ Transfers control to some other state
(finite state)

Trans

It's just a convention to come back to starting pt.

Church-Turing Thesis: Turing machine is sufficiently rich to capture "ANY" computing system

Computability Theory: What is programmable & what is not ??
i.e. what language can be recognised or what decision problem can be solved with TM's & what not ??

A Turing Machine $M = (\mathcal{Q}, \Sigma, \delta, q_0, q_A, q_R)$ where

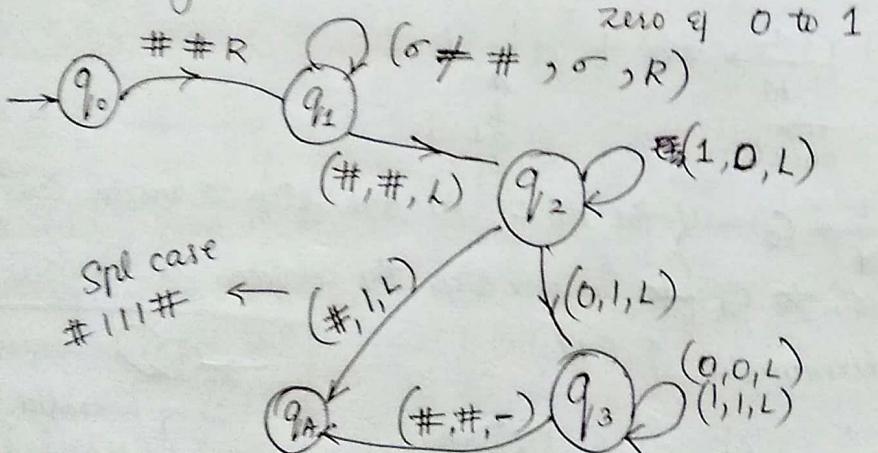
- i) \mathcal{Q} is a finite set of states
- ii) Σ is an alphabet (incl. $\# \in \Sigma$) - spl symbol in alphabet
- iii) $q_0, q_A, q_R \in \mathcal{Q}$ - start, accepting & rejecting state
- iv) δ - transition function: δ is a map that takes a i/p state & symbol & maps to next m/c state \downarrow what are you gonna put at the tape end and whether we should move to left, right or stay

$$\delta: \mathcal{Q} \times \Sigma \rightarrow \mathcal{Q} \times \Sigma \times \{L, R\}$$

(TM. we can write)

B) Turing machine for computing $f(x) = x + 1$

ans) Given eg: $\# 1011-011 \#$ - In the last all ones till 1st zero is changed to zero & 0 to 1.



$$\begin{cases} \delta(q_0 \#) = (q_1, \#R) \\ \delta(q_1, 0) = (q_1, 1, R) \\ \delta(q_1, 1) = (q_1, 1, R) \\ \delta(q_1, \#) = (q_1, \#R) \\ \delta(q_3, 0) = (q_1, 0, R) \end{cases}$$

Spl case
~~#111#~~
~~000~~

Configuration* (is unique $\because \delta$ is a fn)

Describe a) State

- b) Tape content (b/w the 1st $\#$ on L & 1st $\#$ on R)
- c) Tape head position

A configuration of M is a string in

$\# (\Sigma - \{\#\})^*$ $((\Sigma - \{\#\}) \times \mathcal{Q}), (\Sigma - \{\#\})^* \#$

e.g. initial $\# 01101 \# \rightarrow q_0$ start

q_0 $\xrightarrow{M, 1}$

$\# 01101 \#$

} for stopping a process of fun starting over again, we need all that

or confign: $\Sigma^* \times (\Sigma \times Q) * \Sigma^*$ with the condition that the leftmost & right-most symbol are $\#$ blank.
 Given a T.M M q/p/x (with our pgm convention) The start confign of M on q/p $x \in (\Sigma - \#)^*$

$$C_M^0(x) = C_0 = \# x \#$$

$C_M^f(x)$ Suppose the m/c is computing fn f. Then after computation the final confign.

$$C_M^f(x) = C_f = \# f(x) \#$$

Turing Machine

A confign of a Turing m/c $M = (Q, \Sigma, \delta, q_0, q_A, q_R)$
 A string of the form $\# \alpha \sigma_q \beta \#$. (There are ∞ many blanks to right & left)

$$\alpha, \beta \in \Sigma^* \quad \sigma \in \Sigma \quad q \in Q$$

Starting confign on q/p/x : $\# \# x \#$

Let c_1, c_2 be 2 configns

$$\# \alpha b a c \beta \# \xrightarrow[M]{\delta} \# \alpha b d c \beta \#$$

one step

We say $c_1 \xrightarrow[M]{\delta} c_2$ if the m/c in one-step transition can change from confign c_1 to c_2 [★ In one step the confign is unique
 $\because \delta$ is a fn]. (Deterministic F.S.M.)

$$c_0 \xrightarrow[M]{\delta} c_1 \xrightarrow[M]{\delta} c_2 \xrightarrow[M]{\delta} c_3 \dots \xrightarrow[M]{\delta} c_n$$

then we say $c_0 \xrightarrow[M]{\delta^i} c_i \quad \forall i \geq 0$

Assumptions: From state q_A & q_R the only transits possible are

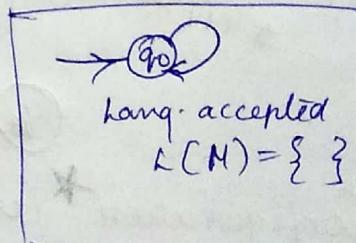
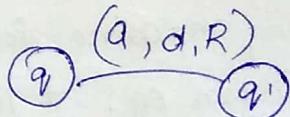
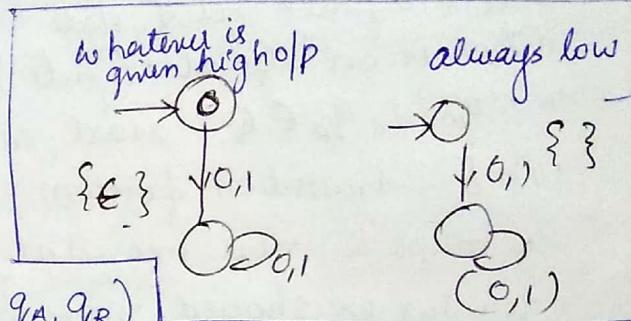
$$\delta(q_A, \sigma) = (q_A, \sigma, -)$$

$$\delta(q_R, \sigma) = (q_R, \sigma, -)$$

let $f: \Sigma^* \mapsto \Sigma^* \quad f(x) = x^2$ assuming $\Sigma = \{0, 1\}$

A turing machine M computes a function f

$$\text{if } \forall x \in \Sigma^* \exists i \in \mathbb{N} \quad c_0 = (\# \# \#) \xrightarrow[M]{\delta^i} (\# f(x) \#)$$



$$\text{Lang. accepted } L(M) = \{ \}$$

Def: A fn $f: \Sigma^* \rightarrow \Sigma^*$ is turing computable if there exist a turing m/c M such that M computes f .

→ There exist functions (from $\Sigma^* \rightarrow \Sigma^*$) that are not turing computable

- [• strings - countably ω
 - fn from $\Sigma^* \rightarrow \Sigma^*$ - uncountable
 - set of m/c is countable
- * Write $c_0 \xrightarrow{M} c_n \Leftrightarrow \exists i \geq 0 \quad c_0 \xrightarrow{M}^i c_n$ ($c_0 \xrightarrow{M}^* c_n \Leftrightarrow c_n \in M$ reachable)

Note:- There is a bijection b/w $\{L \mid L \subseteq \Sigma^*\}$ and $\{f : \Sigma^* \rightarrow \{0,1\}\}$

$$L \xrightarrow{\text{Bijection}} f_L(x) = \begin{cases} 1 & \text{if } x \in L \\ 0 & \text{if } x \notin L \end{cases} \quad \text{Boolean fns.}$$

Set of all boolean fns: uncountably ω

$$L_f = \{x \mid f(x) = 1\} \leftarrow f$$

Consequence: Since $\{L \mid L \subseteq \Sigma^*\} = \mathcal{Q}^{\Sigma^*}$ is uncountable there exist a lang. L such that f_L is not turing computable.

A turing M/c M decides a language L if $\forall x \in \Sigma^*$

$$\text{if } x \in L \Rightarrow (\# x \#) \xrightarrow{M}^* (\# \#) \quad (\text{erasing tape once we reach accepting state is just a technicality})$$

$$\text{if } x \notin L \Rightarrow (\# x \#) \xrightarrow{M}^* (\# \#) \quad \begin{matrix} \bullet \text{Soundness} \\ \bullet \text{Guaranteed termination} \\ \bullet \text{Completeness} \end{matrix}$$

Def: A L is turing decidable if \exists m/c M such that M decides L -
(deciding accept is diff)

A m/c M accepts $L \subseteq \Sigma^*$

$$\text{if } \forall x \in \Sigma^* \quad \text{if } x \in L \quad (\# x \#) \xrightarrow{M}^* (\# \#)$$

$$\text{if } \forall x \notin L \quad (\# x \#) \xrightarrow{M}^* (d \# \#) \quad \text{for any } d, b \in \Sigma^*$$

M/c \downarrow may go to infinite loop or reject.

L is Decidable
(Turing) \Rightarrow L is Acceptable
(Turing)

* HALTING PROBLEM: Given (M, x) M is a T.M $x \in \Sigma^*$ will M halt on $i/p x$,

Recap.

Notation: $C_1 \xrightarrow[M]{*} C_2$ is used for " C_2 is reachable from C_1 in 0 or more steps"

Def: A language L is accepted by a m/c M , if

$$1) \forall x \in \Sigma^* \text{ if } x \in L \quad C_0^M(x) \xrightarrow[M]{*} C_A^M$$

$$2) \forall x \in \Sigma^* \text{ if } x \notin L \quad C_0^M(x) \not\xrightarrow[M]{*} C_A^M$$

M decides L if

$$1) \forall x \in L, \quad C_0^M(x) \xrightarrow[M]{*} C_A^M \quad 2) \forall x \notin L, \quad C_0^M(x) \not\xrightarrow[M]{*} C_A^M$$

A $f: \Sigma^* \mapsto \Sigma^*$ is a turing computable function if there exist a TM M such that starting $\forall x \in \Sigma^*$

$$C_0^M(x) \xrightarrow[M]{*} \# f(x) \#$$

L is a turing decidable language if there exist a m/c M that decides L

L is turing acceptable if there exist a turing m/c M that accepts L (recursive language)

(recursively enumerable language)

Properties of decidable languages

1) If L_1, L_2 are T.D then $L_1 \cup L_2, L_1 \cap L_2, \overline{L_1}, \overline{L_2}, \dots$ are T.D

$$M_{L_1 \cup L_2}(x) = \{ \quad / * \text{ let } M_1 \text{ decide } L_1 \text{ & } M_2 \text{ decide } L_2 \quad \}$$

If $M_1(x) = \text{Accept}$, return 1

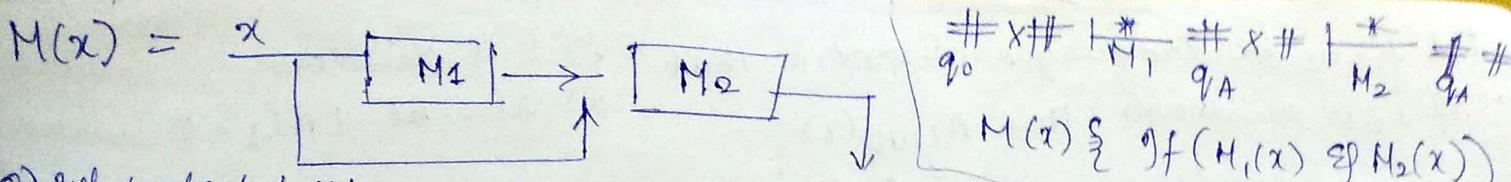
If $M_2(x) = \text{Accept}$, return 1

return 0;

} RE TA.

If L_1, L_2 are recursively enumerable or turing acceptable. Is $L_1 \cap L_2$ RE?

let M_1 accept L_1 & M_2 accept L_2



Q) What about $L \cup L_2$.

(If 1 m/c goes to ∞ loop)

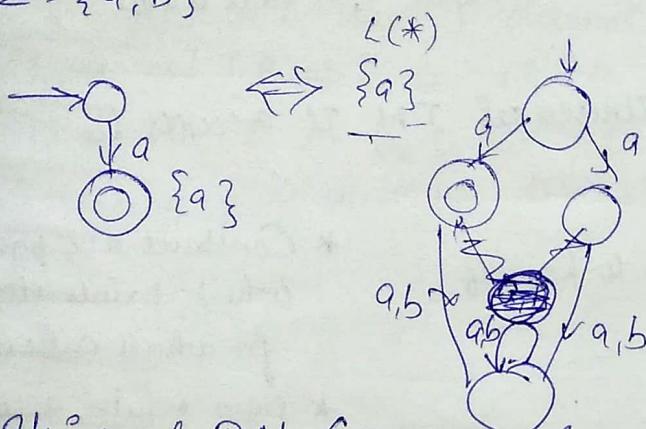
Keep simulating M_1 & M_2 on alternate steps & accept if one of them is accepting.

• Concurrency

If one terminates $\xrightarrow{q \text{ rejects}}$ continue with

N.F.A.

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



Complement won't be obtained
& we can't change accepting & non-accepting state.

Universal T.M (Program Interpreter)

$L_u = \{ (M, x) \mid M \text{ accepts } x \} .$ = HALTING PROBLEM
UNIVERSAL LANGUAGE

Is it possible to design a TM m/c U such that U accepts if/p (M, x)
 \Downarrow U accepts x .

$\# M \# x$ (See Marvin Minsky) - if interested

If M accepts x , U accepts $M(x)$

Given M define $L(M) = \text{lang. accepted by } M$ $L(u) = L_u$

Qn: Is L_u decidable??

Prove that L_u is not decidable

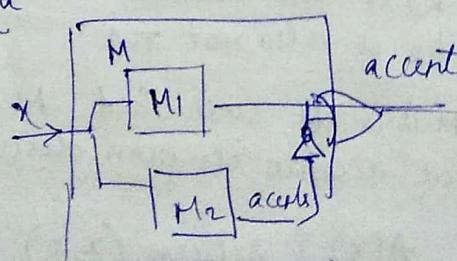
\Rightarrow Suppose L, \bar{L} are TA.

(Let M_1, M_2 accepts $L \& \bar{L}$)

\hookrightarrow Then both $L \& \bar{L}$ are TD

Converse also true.

i.e. TD iff both $L \& \bar{L}$ are TA.

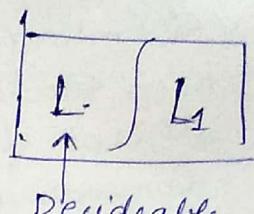


Time shared /
not parallel

Let L, L_1 be languages. Suppose that i) L is decidable

If L_1 is decidable then $A_{L_1 \cup L}(x)$ ii) also let $L \cap L_1 = \emptyset$

$\{ \begin{array}{l} \text{If } (x \in L_1) \text{ or } (x \in L) \\ \quad \text{return 1;} \\ \text{else return 0;} \end{array} \}$



• If $L_1 \cup L$ is decidable, then is L_1 decidable?

when L is decidable, $L \cap L_1 = \emptyset$ then $L_1 \cup L$ is decidable $\Leftrightarrow L_1$ is decidable

• If L is decidable, $L \cap L_1 = \emptyset$ $L \cup L_1$ is decidable $\Leftrightarrow L_1$ is decidable

$$L_u = \{ (M, x) \mid M \text{ accepts } x \}$$

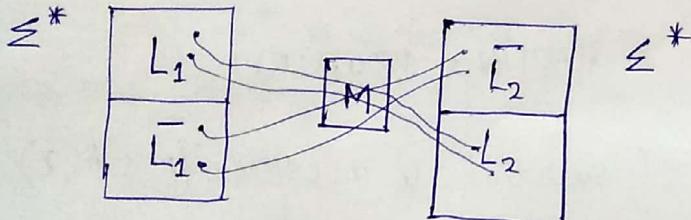
- Is turing acceptable because the universal T.M U accepts L_u .

Redⁿ b/w 2 languages L_1 & L_2

Def: A turing m/c M is a redⁿ from L_1 to L_2 if

- i) $\forall x \in L_1, M(x) \in L_2$
- ii) $\forall x \notin L_1, M(x) \notin L_2$

Theorem: L_u is not turing decidable.



- * Construct a C pgm which prints itself fn which calls itself
- * pgm which accepts nothing but itself

Def: $L_1 \leq_m L_2$ [L_1 is (many-one) reducible to L_2] if there is redⁿ from L_1 to L_2 .

Obs: If $L_1 \leq_m L_2$ $\xrightarrow{L_1} [m] \xrightarrow{L_2} [m_{L_2}]$

a) If L_2 is T.D then L_1 is T.D

b) If L_2 is TA then L_1 is TA

Reducability carries :-

- a) Difficultly from left to right
- b) Solvability from right to left

If L_1 is undecidable L_2 is undecidable

If L_1 is not T.A L_2 is also not T.A

Define: $L_0 = \{ M \mid M \text{ is a TM such that } M \not\in L(M) \}$
to set of machines that accept its own description.

Claim: $L_0 \leq_m L_u$ $A(x) \{ \text{return } (x, x); \}$

If $x \in L_0 \Leftrightarrow x = M$ for some T.M M such that $M \in L(M) \Leftrightarrow (M, M) \in L_u$
 $\Rightarrow L_0$ is not TD then L_u is not turing decidable.

L_0 is not TD $\Leftrightarrow \bar{L}_0$ is not T-D

$\overline{L_0} = \{x \mid x \text{ does not represent a TM}\} \cup \{M \mid M \text{ is a TM such that } M \notin L(M)\}$
 $L \cup L_1$
 $(L \cap L_1 = \emptyset)$
 $\boxed{L} \boxed{L_1}$
 (easily decidable)

To show $\overline{L_0}$ is undecidable show L_1 is undecidable.

Claim: L_1 is not T.A.

Proof: Suppose L_1 is T.A. Let T be a TM that accepts L_1 .

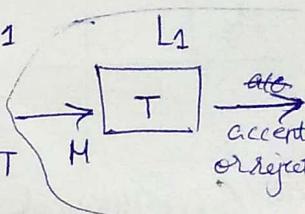
T accepts input M iff M does not accept M .

When if p_T to T is T we get T accepts if $p_T \Leftrightarrow T$ does not accept T is a contradiction. Hence T does not exist.

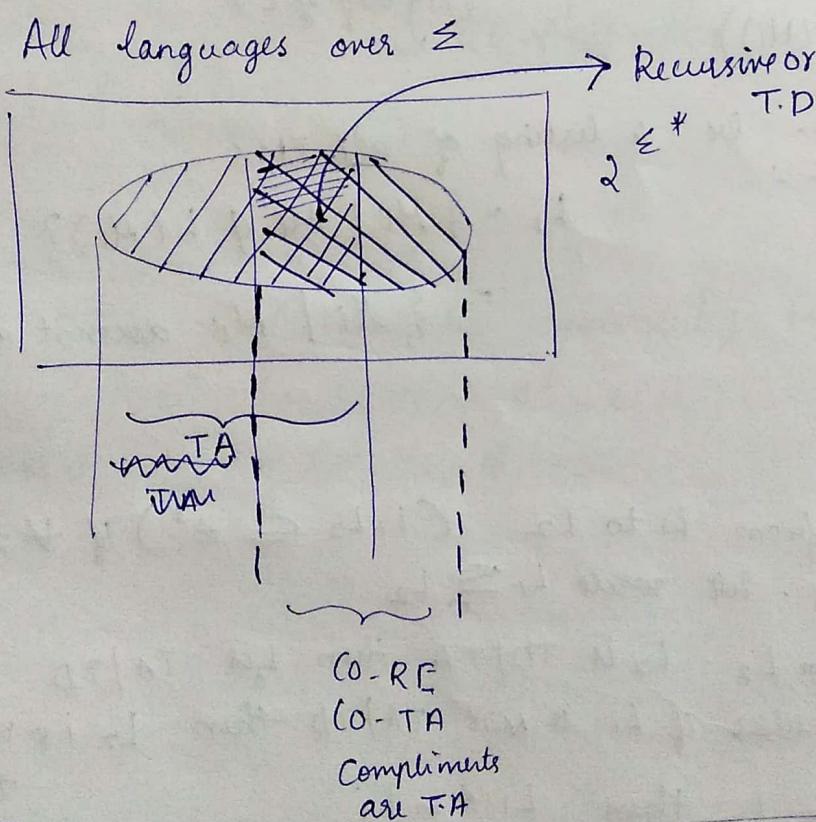
$\Rightarrow L_1$ is not T.A $\Rightarrow \overline{L_0}$ is not T.A

$\Rightarrow \overline{L_0}$ is not TD $\Rightarrow \overline{L_0}$ is not T.D $\therefore \overline{L_0} \leq_m \overline{L_0}$

\therefore Halting problem is not decidable.



- $\overline{L_0}$ is ~~not~~ T.A
 $\Rightarrow \overline{L_0}$ is T.A.
- $\overline{L_0}$ is not T.A



Another way of showing that unsolvable problem exists.

Obs: The set of all TMs is countable: let $M_0, M_1, M_2, M_3, \dots$ be an enumeration of all TMs.

$\therefore \Sigma^*$ is countably ∞ let $x_0, x_1, x_2, x_3, \dots$ be an enum of all strings in Σ^*

| | x_0 | x_1 | x_2 | x_3 | x_4 | \dots |
|----------|-------|-------|-------|-------|-------|---------|
| M_0 | | | | | | |
| M_1 | | | | | | |
| M_2 | | | | | | |
| M_3 | | | | | | |
| \vdots | | | | | | |

$L = \{ \}$
 for $i=0 \text{ to } \infty$
 $\{ \text{ if } x_i \text{ is not accepted} \}$
 by M_i add x_i to L
 $\}$
 $L = \{ x_i \mid x_i \notin L(M_i) \}$

Q) Grow through diagonal why??

Claim: L is not accepted by any M_i

Suppose M_i accepts L , then $x_i \in L(M_i) \Leftrightarrow x_i \in L$

$$\begin{aligned} L &\stackrel{\Downarrow}{=} L(M_i) = L \\ (\because L &= L(M_i)) \end{aligned}$$

$$\Leftrightarrow x_i \notin L(M_i) - \text{Contradiction.}$$

(By def of L)

Recap: Let M_0, M_1, \dots be a listing of all TMs

$M_0 \quad \square$

$$L_1 = \{ M_i \mid M_i \notin L(M_i) \}$$

$M_1 \quad \square$

$$= \{ M_i \mid M_i \text{ does not accept } M_i \}$$

$M_2 \quad \square$

A TM M is a redn from L_1 to L_2 ($L_1, L_2 \subseteq \Sigma^*$) if $\forall x \in \Sigma^*$
 $M(x) \in L_2 \Leftrightarrow x \in L_1$. We write $L_1 \leq_m L_2$

Properties: If $L_1 \leq_m L_2$ & L_2 is TD/TA then L_1 is TA/TD

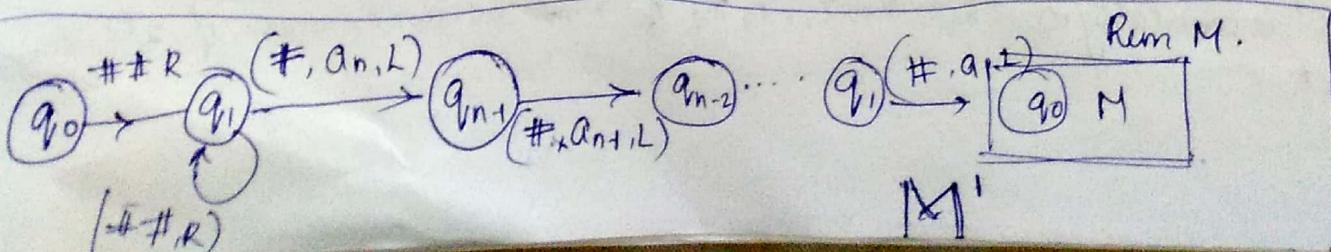
If in particular if L_1 is not TA/TD then L_2 is not

If $L_1 \leq_m L_2$ $L_2 \leq_m L_3$ then $L_1 \leq_m L_3$

T.A/TD

$A(m, x)$ { If i/p is an instance of L_2 $x = a_1, a_2, \dots, a_n$ (x is accepted by M)
 return M' | M' looks as below }

M' that erases its i/p write x to the tape of M .



M accepts $x \Leftrightarrow M'$ accepts all i/p's

i.e. $(M, x) \in L_u \Leftrightarrow L(M') = \Sigma^*$

$(M, x) \in L_u$ then $L(M') = \Sigma^* \Rightarrow M' \in L_0$

$(M, x) \notin L_u$ then $L(M') = \emptyset \Rightarrow M' \notin L_0$

$L_0 = \{M \mid L(M) = \Sigma^*\}$ = set of all pgms that accept all i/p's

A is redn from L_u to L_0 i.e $L_u \leq_m L_0$

$L_1 = \{M \mid L(M) \neq \emptyset\} \quad L_u \leq_m L_1$

$L_2 = \{M \mid L(M) \text{ contains } \in\}$ $L_u \leq_m L_2$

$\{M \mid L(M) \text{ is turing acceptable}\}$

$\{(M_1, M_2) \mid M_1, M_2 \text{ are T-M such that } L(M_1) = L(M_2)\}$ - Equivalence pgm
Given 2 pgms are they computing the same thing.

Claim: $L_0 \leq_m L_{EQ}$ L_0 : set of all mpc's that accept everything.

Redn $A(N)$ {
 $M = M_1$
 return (M, M_1) ;
}

$$M_2 = \boxed{q_0 = q_A} \\ L(M) = \Sigma^*$$

If $L(M) = \Sigma^*$, then $L(M) = \Sigma^* = L(M_2)$

i.e. If $M \in L_0$ then M_1, M_2 (are equivalent) $M, M_2 \in L_{EQ}$

If $L(M) \neq \Sigma^*$, then $L(M_1) \neq \Sigma^* = L(M_2)$

i.e. If $M \notin L_0$, then $(M, M_2) \notin L_{EQ}$

whatever be the i/p.
say w which is not
accepted by M .
Then M' erases w &
writes x (which is accepted
by M) on tape
 $\therefore M'$ accepts every
string