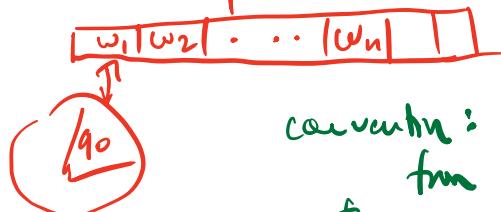


Transition Function

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

old state scanned symbol new state new symbol move left or right

$w \in \Sigma^*$ input $|w| = n$



convention: if more than left end of the tape has an L just stay there.

Formalizing Computation : Configurations

- tape content
- state
- head position

Configuration $\in \Gamma^* Q \Gamma^*$

↑ ↑ ↑
content of tape to state currently contents of tape to
left of scanned symbol right of read head
read head up to further of:
 last non-blank
 last cell TM has looked at.

typical: $uqav$

Assuming $Q \cap \Gamma = \emptyset$
 without loss of generality

so we can understand configuration

TM Operator: $M = (Q, \Sigma, \Gamma, \delta, q_0, q_f)$ Configuration $\delta(q, a) = (p, b, R)$: $uqav$ Yields in one step empty tape t_M^* if $v \neq \epsilon$
 t_M^* $ubpv$ if $v = \epsilon$

$\delta(q, a) = (p, b, L)$: $ucqav$ t_M^* $upcbv$
 qav t_M^* $p bv$
not at left end of tape

Yields t_M^* : Two configs C, D
 $C t_M^* D$ iff $\exists C_0, C_1, \dots, C_t$ for some $t \geq 0$
 $C = C_0, D = C_t$ $C = C_0 t_M C_1 t_M \dots t_M C_t$

Start configurations on input w : $q_0 w$ if $w \neq \epsilon$
 $\underline{q_0 u}$ if $w = \epsilon$

Convention: always write $q_0 w$ as

$uq_{acc}v$ is an accepting configuration

$uq_{rej}v$ is a rejecting configuration

M accepts w iff $q_0 w t_M^*$ an accepting configuration
rejects w iff $q_0 w t_M^*$ a rejecting configuration

$L(M) = \{w \in \Sigma^*: q_0 w t_M^* uq_{acc}v \text{ for some } u, v \in \Gamma^*\}$
 is language recognized by M

L is Turing-recognizable iff \exists TM M s.t. $L = L(M)$

M is a decider iff for all $w \in \Sigma^*$, M accepts w or

L is decidable iff \exists decider TM M s.t. $L = L(M)$

Turing Machines

Recall

$$(Q, \Sigma, \Gamma, \delta, q_0, q_{acc}, q_{rej})$$

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

configurations, t_M , t_M^*
yields in one step yields

M accepts w iff $q_0 w t_M^* u q_{acc} v \quad u, v \in \Gamma^*$
rejects w iff $q_0 w t_M^* u q_{rej} v \quad u, v \in \Gamma^*$

M is a decider iff $\forall w \in \Sigma^*$
M accepts w or M rejects w

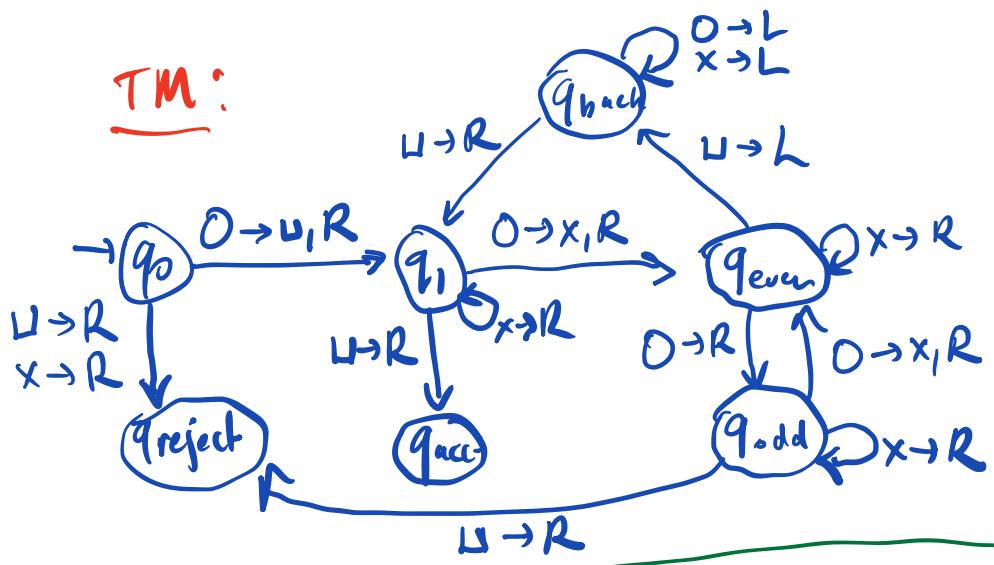
Example: $\{0^{2^n} : n \geq 0\} \quad \Sigma = \{0\}$ input alphabet

- Plan:
1. Check if one 0, if yes accept
 2. If more than one 0, cross off every second 0 (if odd reject)
 3. Repeat above with remaining 0's

e.g. $0 \cancel{\phi} 0 \cancel{\phi} 0 \cancel{\phi} 0 \cancel{\phi} 0 w$ reject

$0 \cancel{\phi} 0 \cancel{\phi} 0 \cancel{\phi} 0 \cancel{\phi} 0 \cancel{\phi} w$ need to mark start
of the string to get back

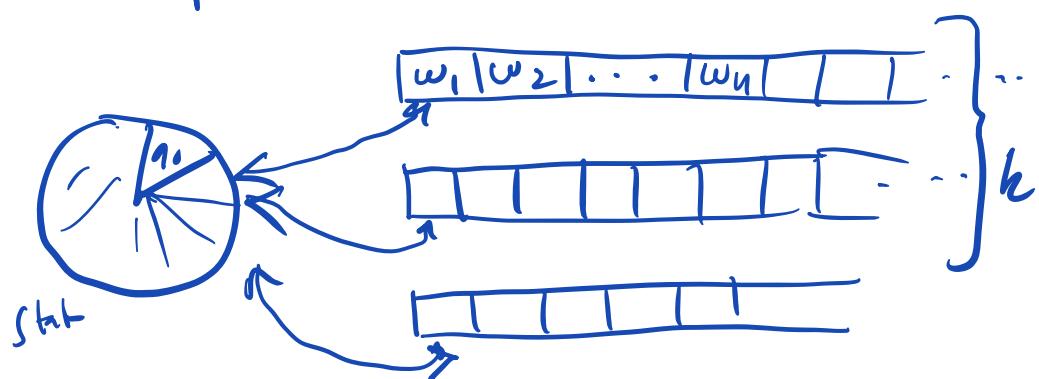
to mark start of string we could use a new tape symbol but to keep TM simple we use a blank \sqcup respectively a 0 and the start.



(Notation: $\overset{p}{\underset{q}{\xrightarrow{\alpha \rightarrow \beta, R}}}$ means $\overset{p}{\xrightarrow{\alpha \rightarrow \beta, R}} \overset{q}{\xrightarrow{R}}$)

Generalization of TMs:

k-tape TM



Transitions based on all symbols scanned
 Input on 1st tape, rest start blank
 Head movement independent.

$$\delta: Q \times \Gamma^k \rightarrow Q \times \Gamma^k \times \{L, R\}^k$$

Theorem Every k -tape TM M is equivalent
 to some 1-tape TM M'

- equivalent:
- M' accepts w iff M accepts w
 - M' rejects w iff M rejects w
 - same input alphabet Σ .

Proof Basic idea:
 represent all k tapes' content
 on a single tape

Suppose $M = (Q, \Sigma, \Gamma, \delta, \dots)$

we create $M' = (Q', \Sigma, \Gamma', \delta', \dots)$

let $\# \notin \Gamma$ be a new symbol

We represent all k tapes' content in M' by

$\# \boxed{\text{Tape 1}} \# \boxed{\text{Tape 2}} \# \dots \# \boxed{\text{Tape } k}$

Since each tape is infinite we only represent
 the portion that is used. The start a...

We will represent the 1st tape entry

$\# w_1 w_2 \dots w_n \# \downarrow \# \uparrow \#$

but we also need to store head position for each tape
We put a \circ over each char if it also has the head on on it.

$$\Gamma^0 = \Gamma_0 \Gamma_1 \dots \Gamma_n$$

($\# \overset{\circ}{w}_1 w_2 \dots w_n \# \downarrow \# \dots \# \uparrow \#$)

So ... first convert $w_1 \dots w_n$ input to above string. *

To figure out what move to make, need to store scanned symbol in state.

- Do L to R sweep recording the symbols under the dots.

- To execute the moves for this step of M

- sweep R to L and execute all the left moves

(rewrite the symbol and shift the symbol just to the left
- if last symbol was a $\#$
put that dot back as the first symbol of that tape)

- sweep L to R and execute all the right moves

most right moves are simple moving the dot one to the right, except when that is # (reached end of used portion of tape) and need to insert a blank symbol and shift the rest of the tape to the right during the sweep.

(to shift by c characters keep track of queue of c most recent chars)

(in state) ready at one end and waiting from the other.)

- Return to the left end.

Note: If original machine ran for T steps
 (say $T \geq n$) new machine may take $O(kT^2)$ steps:

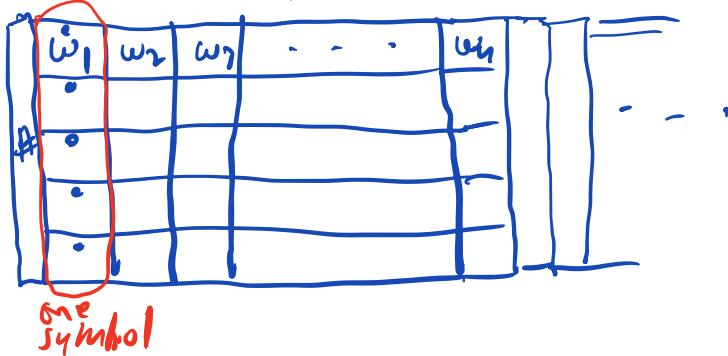
Original step cost = # cells in tapes
 $\leq kT + k + 1$
 Total $O(kT^2)$

This simulation is step by step
 and the machine accepts

Note: k is a fixed constant independent of the input. Need to know k to define the 1-tape TM. \square

Alternative simulation: Multitrackd.

New set of symbols $\Gamma' = \Gamma \cup (\Gamma \cup \bar{\Gamma})^k$



each tape represented as a "track"

Behaviour is same as before:

Sweep L to R to collect
Scanned symbols

Sweep R to L done L moves

Sweep L to R done R moves

(maybe make multitracked
multi-dotted blank + replace blank)

return to L end.

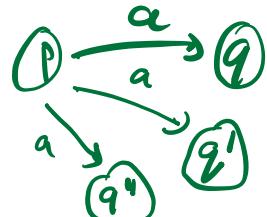
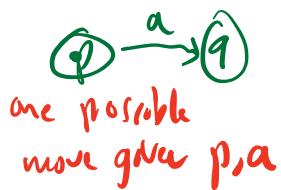
Time: $O(T^2)$ no shifting required

Fact: even converting 2-tapes to 1-tape
best possible simulation is $O(T^2)$

Nondeterministic TMs (NTMs)

conceptual, not practical model

Recall $\text{deterministic DFAs}$ vs $\text{nondeterministic NFAs}$



many possible moves
given p,a (or none)

We see that NFAs were convenient but for every NFA there was an equivalent DFA
(though it requires exponentially more states in the worst case)

With NTMs we get the same option



Formally only change is that now

$$\delta: Q \times \Gamma \rightarrow \mathcal{P}(Q \times \Gamma \times \Sigma^* R)$$

power set

i.e. a set of possible moves,
not just one

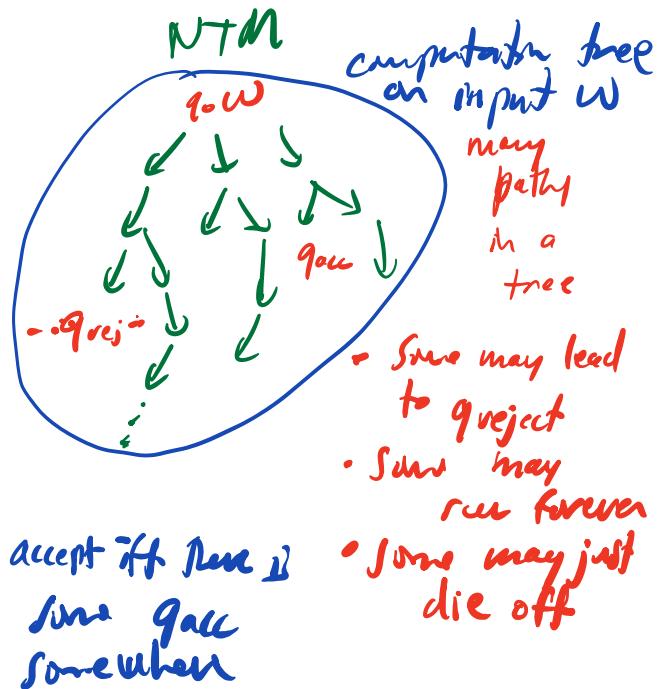
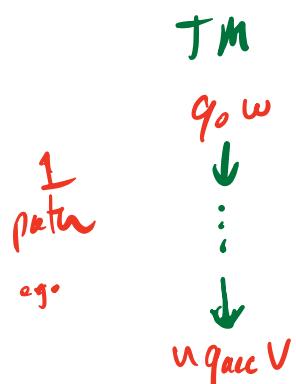
Execution of NTM:

start configuration $q_0 w$

$C \xrightarrow{M} D$ iff there some move
in δ that takes C to
 D in one step.

$L(M) = \{ w : q_0 w \xrightarrow{M} uq_{acc}v \quad u, v \in \Sigma^*\}$
is the language recognized by M .

We \rightarrow to denote \xrightarrow{M}

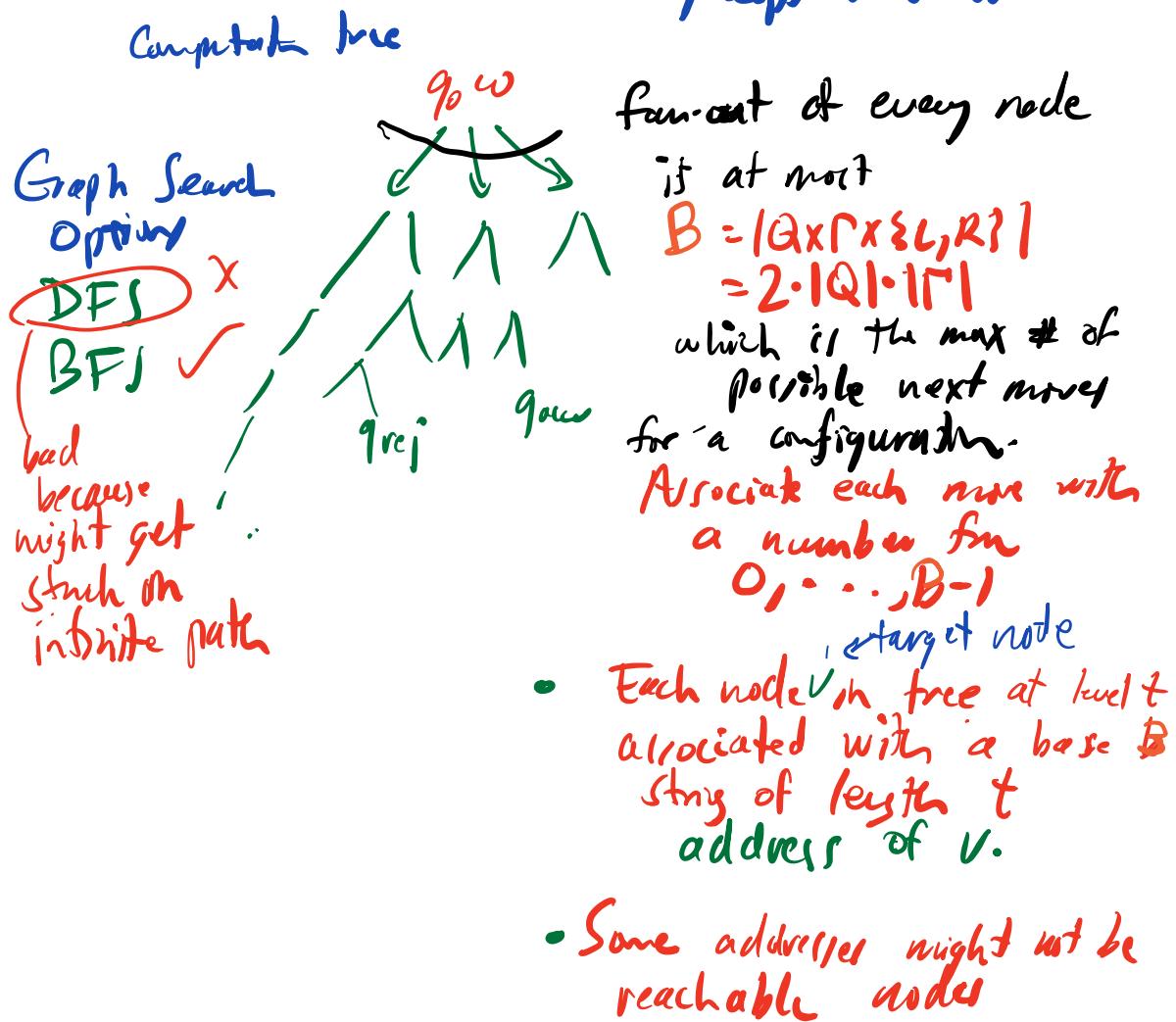


View of Nondeterminism:

- 'God's eye' view accept iff qacc somewhere on infinite tree
- Perfect guesser at each step if there is a move to lead to accept M will take one
- Parallel exploration M explores all branches in parallel

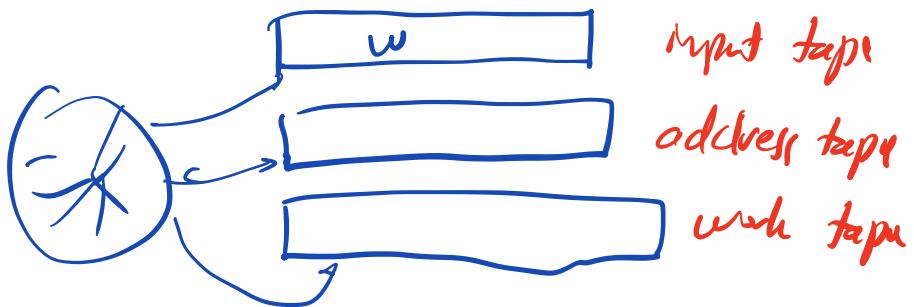
Theorem: For every NTM there is an equivalent TM

Proof idea: Graph search: explore every node in computation tree, stopping early if accept is found



Overall idea: loop through all addresses (strings, base B) figuring out what config would be at that node and stop & accept iff that accept

Implementation: 3 tapes



Repeat forever

1. Copy Input from input tape to work tape
2. Use address on tape 2 to see which sequence of moves to try
 - Execute each move on work tape
if legal for M
 - if not legal about this address
 - if reject reached then halt & accept
3. Erase work tape

4. Run machine to convert address on tape 2 to next address (just as with HW1 problem 3 but for bigger B)

$\epsilon, 0, 1, \dots, B-1, 01, 02, \dots, 0(B-1)$, ...
This will find a acc if true in one

Note: If at some address leads to all address about or reject, can reject.

This means that if NTM always halts
then TM is a decider \square

Suppose original NTM accepted with
 T steps

New TM will explore $\approx b^T$ addresses
(actually $\sum_{f=0}^{T-1} b^f$)

This is $2^{O(T)}$ since b
is constant. ~~is constant~~

P vs NP question: can we reduce
 $2^{O(T)}$ to $\text{poly}(T)$?

Enumerator TMs

- print
- no input
 - read/write work tape initially blank
 - write-only 1-way output tape
- alphabet - $\sum \{ \$ \} \quad \$ \in \sum$
 $\$ = "\backslash n"$

This is a 2-tape TM but all the work is
done on the first tape
string is printed iff it appears between $\$$
on tape 2.

Language enumerated by M if
 $E(M)$ the set of strings $w \in \Sigma^*$
 that M eventually prints
 (between two $\$$ on output
 tape)

Def'n L is recursively enumerable (r.e.)
 - iff there is some enumerator TM
 M s.t. $L = E(M)$.

Then L is an enumerator M
 s.t. $L = E(M)$

Then L is recursively enumerable
 $\Leftarrow L$ is Turing-recognizable
 i.e. $\exists \text{TM } M$ s.t. $L = E(M) \Leftrightarrow \exists \text{TM } M' \text{ s.t. } L = L(M')$

Proof (\Rightarrow) Suppose there is an enumerator
 M s.t. $L = E(M)$

3-tape TM M' recognizing L :
 we build M into M' but nothing if a bit
 • on input w , run M (using 2 other tapes)
 • every time M prints a $\$$ compare the string it just produced to w . If they are equal accept
 It not just continue

Clearly M' will accept w iff
 M prints w .

(\Leftarrow) this is the harder direction

Suppose we have a TM M' with $L = L(M')$

• We need to build an enumerator for L that runs M' on all possible strings in Σ^*

• We can generate all the strings in Σ^* one after another

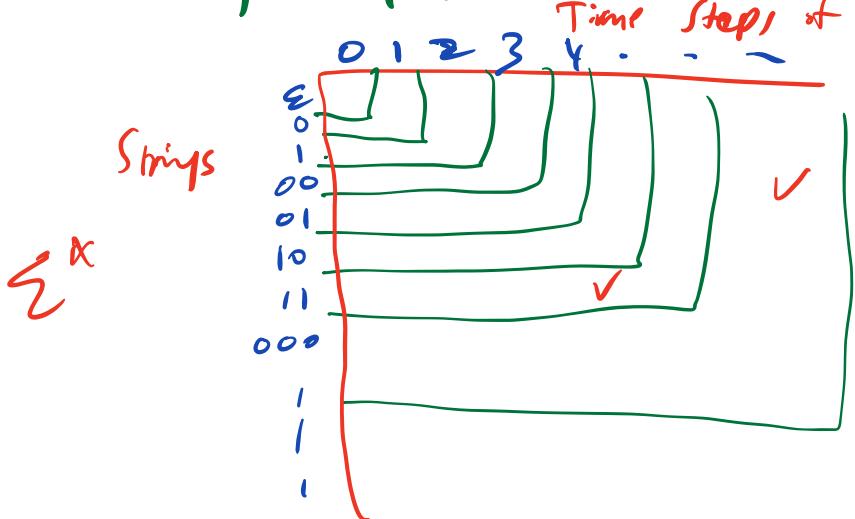
using the counter method we used for address(es)

Obvious idea: Every time we produce $w \in \Sigma^*$ run M' on it.

Problem: That's an infinite # of strings but just one computer may run forever!

To fix this we use an idea from Cantor

Key Savvy idea: "Dovetailing"



We need to try every string for all possible # of time steps (find all the accept)

Enumerator M'' :

For $t \geq 0 \dots \infty$ do
 For each of the first t strings $w \in \Sigma^*$
 Run M'' on input w for t steps
 If M'' accept print w

Has a modified version of M'' inside it

Eventually, will explore every point in above infinite table so will final and print all accepted strings
 $\therefore E(M'') = L$

Another use of 2-tape ...

Thm If A and \bar{A} are T-rec then
 A is decidable

Proof Suppose A and \bar{A} are T-m-recognizable
by TM, M_A and $M_{\bar{A}}$:

Decider M for A :

On input w :

Copy w to a second tape

Run M_A and $M_{\bar{A}}$ one step

at a time on each
tape "in parallel"

One of M_A or $M_{\bar{A}}$
will halt and
accept

- If M_A accepts then accept
- if $M_{\bar{A}}$ accepts then reject

So far... ~

$$\begin{aligned} k\text{-tape TM} &\equiv (\text{-tape TM}) \\ \text{NTM} &\equiv \text{TM} \\ 2\text{-dim TM} &\equiv \text{TM} \quad (\text{Home work}) \end{aligned}$$

Also TM = Random Access Machine

Random Access Machine

Idealized Computer

Just like model for ordinary assembly language except that

- each register holds an arbitrary integer (^{initially} 0)
- there is one register for each natural number
0, 1, 2, ...

Indirect addressing still allowed.

- register indexed uses absolute value

Simulation : Configuration - store value of each register touched between # ~ # on tape

e.g. $\# i \# R_i \#$
 $\begin{matrix} \uparrow \\ \text{battery} \end{matrix} \quad \begin{matrix} \uparrow \\ \text{value} \end{matrix}$ (rest are implicitly 0)

⇒ C, Java, any programming language + unbounded memory $\equiv TM$

Also $\text{TM} \equiv \lambda\text{-calculus} \equiv \mu\text{-recursive functions}$

Turing 1936 Kleene 1937

Church-Turing Thesis (1936)

Any reasonable model that captures all of computation is equivalent in power to Turing machines

Not a statement that can be proved or disproved since it uses a notion "reasonable model" which is not formal

The text phrases this as

$$\text{Algorithm} = \text{TM Algorithm}$$

but this only makes sense if the left side is meant to say "our intuitive notion of algorithm"

Since it was put forth, many other models of computation have been developed and all models are either

- equivalent to TM e.g. quantum computers (or weaker)
- allow uncomputable operations with infinite action in a single step