

# Models of Computation

history: beginning of 20th century: people asking for "mechanical procedures" for solving math problems - e.g., solving integer polynomial equations

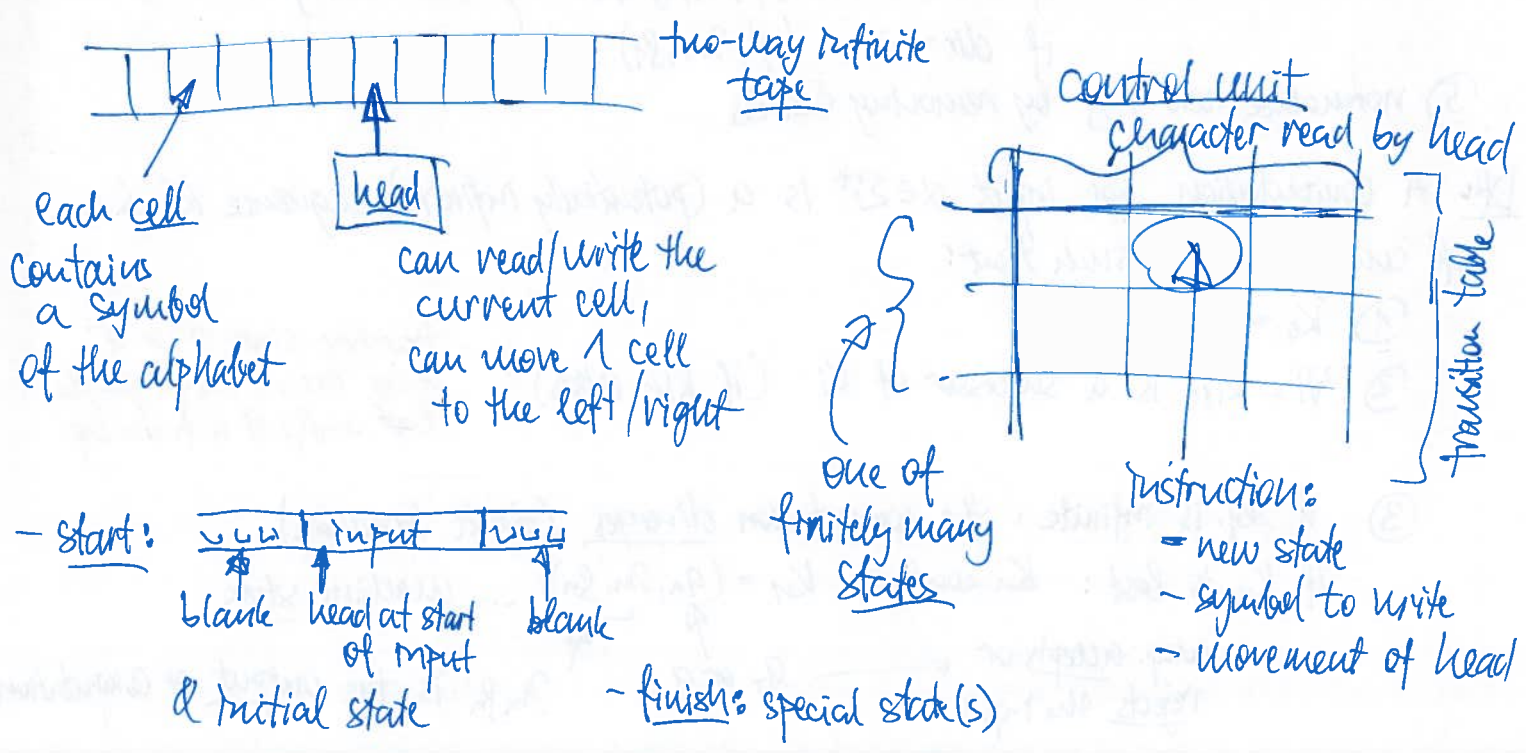
1930s: Gödel, Church, Kleene, Turing: formal definitions of computation (all of them equivalent, yet different)

What problems we want to solve?

↳ fix "language"

- $\Sigma$  - finite alphabet of symbols (characters) - examples:  $\{0,1\}$ ,  $\{a \dots z\}$ , math symbols
- $\Sigma^*$  - set of all words (finite sequences) over  $\Sigma$ 
  - $\epsilon$  ... empty word
  - $|\alpha|$  ... length
  - $\alpha\beta$  ... concatenation
  - symbol  $\approx$  1-symbol word
  - $\alpha[i]$  ... i-th symbol (starting with 0)
  - $\alpha[i:j]$  =  $\alpha[i] \dots \alpha[j-1]$  ... subword
  - $\alpha[:j]$  =  $\alpha[0:j]$  ... prefix
  - $\alpha[i:]$  =  $\alpha[i:|\alpha|]$  ... suffix
- problem: function from  $\Sigma^*$  to  $\Sigma^*$
- decision problem:  $f: \Sigma^* \rightarrow \{0,1\}$ 
  - ↳ also viewed as language  $L \subseteq \Sigma^* : \alpha \in L \Leftrightarrow f(\alpha) = 1$  (characteristic function of a set)
- usually we find encoding of inputs (e.g. polynomials) to strings
  - concrete encoding doesn't matter (they can be converted algorithmically)
  - what happens if the input string is not a valid encoding?
    - ↳ suppose we always answer  $\epsilon$  or 0 in such cases.

## Turing Machines motivation: a mathematician with finite mind working on an infinite blackboard

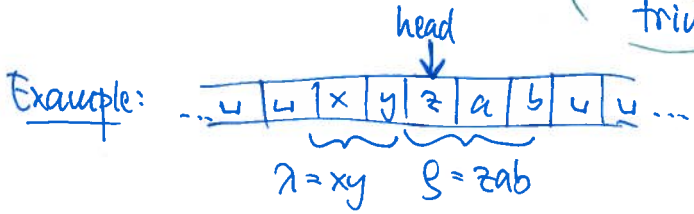
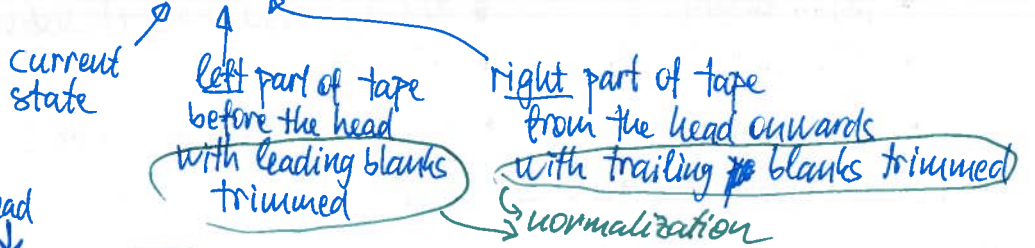


Now formally...

Df: A Turing machine consists of:

- $Q$  ... a finite set of states
  - $q_0 \in Q$  ... initial state
  - $q_+, q_- \in Q$  ... final states (accepting & rejecting)
  - $\Sigma$  ... non-empty finite input alphabet
  - $\Gamma \supseteq \Sigma$  ... finite work alphabet
  - $\sqcup \in \Gamma \setminus \Sigma$  ... blank symbol
  - $\delta : (Q \setminus \{q_+, q_-\}) \times \Gamma \rightarrow Q \times \Gamma \times \{\leftarrow, \cdot, \rightarrow\}$  ... transition function
- }  $q_0, q_+, q_-$  all distinct

Df: Configuration of the TM:  $(q, \lambda, \rho) \in Q \times \Gamma^* \times \Gamma^*$



$\lambda \rho$  = non-blank part of tape on empty tape, all positions of the head are the same configuration

Df: A configuration  $(q, \lambda, \rho)$ ,  $q \neq q_+, q_-$  has a successor defined in this way:

- ① extend  $\lambda$  by a leading  $\sqcup$ ,  $\rho$  by a trailing  $\sqcup$
  - ② now,  $\lambda = \lambda'x$ ,  $\rho = x\rho'$  for some  $x, y, \lambda', \rho'$
  - ③ evaluate  $\delta(q, x)$  ... get  $(q', x', dir)$
  - ④ execute instruction:
    - if  $dir = \cdot$  ...  $(q', \lambda, x'\rho')$
    - if  $dir = \leftarrow$  ...  $(q', \lambda', yx'\rho')$
    - if  $dir = \rightarrow$  ...  $(q', \lambda x', \rho')$
  - ⑤ normalize new  $\lambda, \rho$  by removing blanks
- } new config.

Df: A computation for input  $\alpha \in \Sigma^*$  is a (potentially infinite) sequence  $K_0, K_1, \dots$  of configurations such that:

- ①  $K_0 = (q_0, \epsilon, \alpha)$
- ②  $\forall i: K_{i+1}$  is a successor of  $K_i$  (if  $K_{i+1}$  exists)

← therefore state  $q_+$  or  $q_-$  never occurs except for the last config of a finite seq.

- ③ if seq. is infinite: the computation diverges (doesn't terminate)
- if  $K_n$  is last:  $K_n$  contains  $K_n = (q_n, \lambda_n, \rho_n)$  ... machine stops
  - comp. accepts or rejects the input ←  $q_+$  or  $q_-$
  - $\lambda_n \rho_n$  is the output of computation



Df: Computability: ↖ also general recursive  
 Function  $f: \Sigma_1^* \rightarrow \Sigma_1^*$  is computable  
 $\equiv \exists$  M Turing machine s.t.  
 $\forall x \in \Sigma_1^* M(x)$  halts and outputs  $f(x)$   
↑  
 M on input  $x$   
 (& its computation)

↖ also partially recursive ↓ divergence  
 Function  $f: \Sigma_1^* \rightarrow \Sigma_1^* \cup \{\uparrow\}$  ( $\uparrow \notin \Sigma_1$ )  
 is partially computable  $\equiv \exists$  M T.m.  
 s.t.  $\forall x \in \Sigma_1^*$ : if  $f(x) = \uparrow$ :  $M(x)$  diverges  
 else  $M(x)$  halts & outputs  $f(x)$

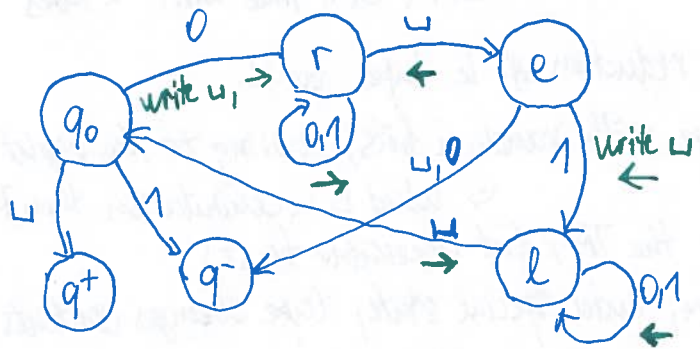
Language  $L \subseteq \Sigma_1^*$  is computable  
 $\equiv \exists$  M T.m. s.t. ↖ also recursive  
 $\forall x \in \Sigma_1^* M(x)$  always halts  
 & (accepts  $x \iff x \in L$ )  
↑  
 ends in  $q^+$   
 ↪ equivalent to char. fn of  $L$  computable

Language  $L \subseteq \Sigma_1^*$  is partially computable  
 $\equiv \exists$  M T.m. s.t. ↓ also recursively enumerable  
 $\forall x \in \Sigma_1^* M(x)$  halts  $\iff x \in L$ .  
 in state  $q^+$   
 ↪ equivalent to  $C_L(x) = \begin{cases} 1 & \text{if } x \in L \\ \uparrow & \text{if } x \notin L \end{cases}$  partially computable

Idea: Time & Space Spent by computation  
↑ # cells visited by the head  
↑ # configurations visited  
 $\neq$  # instructions executed

} will serve as basis for complexity theory (later)

Example: Recognizing  $\{0^n 1^n\} \subseteq \{0,1\}^*$  by accepting/rejecting.  
 Idea: erase first 0 & final 1, repeat.



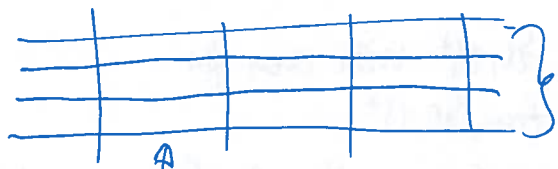
doesn't matter

- $\Sigma = \{0,1\}$
- $\Gamma = \{0,1, \sqcup\}$
- $Q = \{q^0, q^+, q^-, r, e, l\}$

Q	0	1	$\sqcup$
$q_0$	$(r, u, \rightarrow)$	$(q^-, ?, ?)$	$(q^+, ?, ?)$
$r$	$(r, 0, \rightarrow)$	$(r, 1, \rightarrow)$	$(e, \sqcup, \leftarrow)$
$e$	$(q^-, ?, ?)$	$(l, \sqcup, \leftarrow)$	$(q^-, ?, ?)$
$l$	$(l, 0, \leftarrow)$	$(l, 1, \leftarrow)$	$(q_0, \sqcup, \rightarrow)$

Ideas: • Encode multiple variables with finite domains in the state - state is a tuple

• Multi-track tape



}  $k$  tracks head reads/writes  $k$ -tuples  
 But all tracks share head position

Remember to en/decode tape at start/end of computation.

### Variants of the TM (robustness of definition)

- ① One-way infinite tape ... 1-way  $\rightarrow$  2-way trivial  
 2-way  $\rightarrow$  1-way "fold tape in half" simulation  
 ↳ equally powerful (set of computable functions remains unchanged...)
- |     |    |    |   |    |    |     |
|-----|----|----|---|----|----|-----|
| ... | -2 | -1 | 0 | +1 | +2 | ... |
|-----|----|----|---|----|----|-----|
- $\rightarrow$
- |    |    |    |    |     |
|----|----|----|----|-----|
| 0  | +1 | +2 | +3 | ... |
| -1 | -2 | -3 | -4 | ... |
| *  |    |    |    |     |
- } 3 tracks  
 \* mark end of tape in track #3

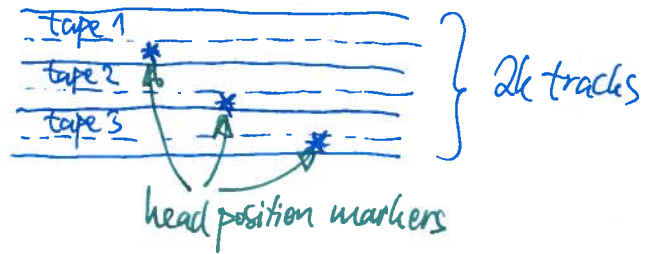
state contains "positive half-tape" switch.

- ② k tapes with independent heads (but sharing a common work alphabet  $\Sigma$ )

- transition function:  $(Q \setminus \{q^+, q^-\}) \times \Gamma^k \rightarrow Q \times \Gamma^k \times \{\leftarrow, \rightarrow, \bullet\}^k$
- configuration, successor, computation easy to extend
  - start: tape #1 contains input, other tapes empty
  - end: tape #1 contains output

- Equally powerful ... k-tape  $\rightarrow$  1-tape:

1 step of orig. machine can be simulated by scanning the whole tape 2 times:



- find all heads, record symbols they see in state
- write symbols back & move heads

actually, you can do it in  $O(n \log n)$  time (exercise)

- But complexity changes:  $\{0^n 1^n\}$  requires super-linear time with 1 tape but can be solved in  $O(n)$  time with 2 tapes

- Later: there is a more efficient reduction of k tapes to 2.

- ③ Randomized TM ... read-only tape with random bits, moving to the right only  
 ↳ what is a computation then? ...

- ④ Oracles (functions defined outside the TM, but accessible to it)
- oracle tape: write query there, enter special state, tape changes contents to the answer

- ⑤ Interactive TM ... outside world can be modelled as an oracle  $\circ$

- ⑥ Exercise: 2-Dimensional tape ... head moves  $\leftarrow, \rightarrow, \uparrow, \downarrow, \bullet$

... in some sense, the most powerful physically feasible computer is a TM with 3-D tape (or maybe 2-D only to allow heat spreading...)

### Exercises:

- accept strings in  $\{0,1\}^*$  with even #1
- reverse a string from  $\{0,1\}^*$
- add / multiply numbers written in binary ... what's the complexity?  
 ↑ non-negative integers