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- PDA: finite memory in states, restricted infinite memory in a stack; accepted context-free languages
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- $\bullet$  Cross off first non-crossed off symbol, move to first non-crossed off symbol after #
- If no non-crossed off symbols after # remain or next symbol is not the same, reject. Else, cross off if equal to the last crossed off symbol
































































































































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- A Turing machine's head's view:



- It cannot see anything outside of its current cell
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- Multiple options:
- write a special symbol at the beginning to encode the beginning of the tape

Other option:

• when looking for beginning of tape: replace current cell contents x with a new symbol  $\dot{x}$  to mark where the head was. If after moving left it reads  $\dot{x}$ , it knows it's at the beginning of the tape.

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- High-level: "Compare words before and after # and accept if equal, reject if not equal"
- Implementation level: giving the formal definition of a Turing machine, with all states and transitions (we'll go through some examples tomorrow)



A Turing machine is a 7-tuple  $(Q, \Sigma, \Gamma, \delta, q_0, q_{accept}, q_{reject})$  where  $Q, \Sigma, \Gamma$  are finite sets and

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- **(** $q_0 \in Q$  is the start state,
- $q_{accept} \in Q$  is the accept state, and
- $q_{reject} \in Q$  is the reject state.

## Configurations

During each computation step, a TM is in a specific *configuration*:

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Notation: uqv encodes that the machine is in state q, pointing at the first symbol in v. Example:



Notation: xxx # qxx1

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 $q_i b v$  yields  $q_j c v$  if  $\delta(q_i, b) = (q_j, c, L)$ .

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A language is *Turing-decidable* [decidable, recursive] if there is a Turing machine that decides it.

Previous example of language  $\{w \# w \mid w \in \{0,1\}^*\}$  was recognized by machine: M= on input w:

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It was, in fact, decided by M!

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- idea: if length=1, accept (if input symbol is correct), otherwise divide length by 2. Repeat How to divide length by 2?

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 $A = \{0^{2^n} \mid n \ge 0\}$ . Want to construct a TM that recognizes (decides?) it. M=on input w:

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- scan input until you read the next 0. If none is found, accept. If one is found, cross it off and cross off every other 0 for the remaining input. If the number of 0's read is odd, reject.
- **③** Return to head of tape (move left until read  $\sqcup$ ).
- go to 2.

 $\rightarrow$  *M* decides *A*!

• Not surprisingly, Turing machines are very powerful!

- Not surprisingly, Turing machines are *very* powerful!
- Can we make it *even more expressive* by, e.g., allowing the machine to also *stay put*, i.e., not move left or right?

#### Definition

A LRS Turing machine is a Turing machine with a transition function is defined as

 $\delta: Q \setminus \{q_{accept}, q_{reject}\} \times \Gamma \rightarrow Q \times \Gamma \times \{L, R, S\}$ 

We can model stay put by adding an extra transition: first move left, then right.

We can model *stay put* by adding an extra transition: first move left, then right. For each  $\delta(q_i, b) = (q_j, c, S)$ , we can rewrite this as  $\delta(q_i, b) = (q', c, L)$  and  $\delta(q', *) = (q_j, *, R)$  where \* is any tape symbol. We can model stay put by adding an extra transition: first move left, then right. For each  $\delta(q_i, b) = (q_j, c, S)$ , we can rewrite this as  $\delta(q_i, b) = (q', c, L)$  and  $\delta(q', *) = (q_j, *, R)$  where \* is any tape symbol. So, equally expressive as a normal TM! • Can we make it even more expressive by, e.g., adding more tapes?

#### Definition

A multitape Turing machine is a turing machine with  $k \ge 2$  tapes, i.e., its transition function is defined as

$$\delta: Q \setminus \{q_{accept}, q_{reject}\} \times \Gamma^k \to Q \times \Gamma^k \times \{L, R\}$$

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- Can this be modelled on a single tape? Yes!
- Idea: encode content of each tape on one tape, using a symbol (#) to separate the different tapes
- in each tape block (space between two #), one symbol is marked (represents where the head is on that tape)

#

С

С

g | #

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More formally:

S = on input w:

• Put S into the following format to model k tapes:

 $\#\dot{w}_1\ldots w_n\#\dot{\sqcup}\#\dot{\sqcup}\#\ldots\#$ 

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**②** To simulate a single move in the multitape TM, S scans from first # to (k + 1)st # to determine symbols under the virtual heads ("check which cells are dotted"). S then makes a second pass over tape and updates cells according to M's transitions.

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#### Theorem

A language is Turing recognizable [decidable] if and only if some multitape Turing machine recognizes [decides] it.

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#### Definition

A nondeterministic Turing machine has a transition function of the form

$$\delta: Q \setminus \{q_{\textit{accept}}, q_{\textit{reject}}\} \times \Gamma \rightarrow P(Q \times \Gamma \times \{L, R\})$$

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- We use 3 tapes: input tape, simulation tape, address tape
- input tape: contains input, will never be altered;
- simulation tape: "where the magic happens"...tape simulating current computational branch in N;
- address tape: tells us which choices to make in the computational tree of N

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- Then a string over {1,...*b*} represents a sequence of choices; e.g., 143 represents that we choose Option 1 after start configuration, then Option 4, then Option 3.
- To ensure that we do not loop before reaching a possible accept configuration, we parse the computational tree with *breadth first search*:
- we order the addresses (strings over  $\{1, \ldots b\}$ ) as follows (lexicographic ordering): 1, 2, ..., b, 11, 12, 13, ..., 1b, 21, 22, ..., bb, 111, ...

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- Replace address tape's contents with next address according to our ordering. Go to 2.

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A little extra work needed for decidability result!  $\rightarrow$  Exercise 3.3 in book!
# Enumerators



- An enumerator is a slightly altered Turing machine:
- It has a working tape and an attached printer
- initializes with an empty working tape, taking no input
- throughout its computation, it can output strings using the printer
- If the enumerator does not halt, it can potentially output infinitely many strings





# Theorem

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A = On input w

- 1. Run E. Every time E prints a string, compare to w.
- 2. If *w* appears in the output of *E*, *accept*.

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- Le Σ be the alphabet of L(A). Then we can order all strings in Σ\* (first list all strings of length 1, then of length 2, etc). Label them s<sub>1</sub>, s<sub>2</sub>, s<sub>3</sub>,.... Then we can construct an enumerator:

E =Ingore input

- 1. Repeat for i = 1, 2, 3, ...
- 2. Run A on  $s_1, \ldots, s_i$  for *i* steps.
- 3. If any computation accepts, print corresponding  $s_j$ .