

CMSC 28100

Introduction to  
**Complexity Theory**

Spring 2024

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# The Church-Turing Thesis

- Let  $L$  be a language

## **Church-Turing Thesis:**

There exists an “algorithm” / “procedure” for figuring out whether a given string is in  $L$  if and only if there exists a Turing machine that decides  $L$ .

← Intuitive notion

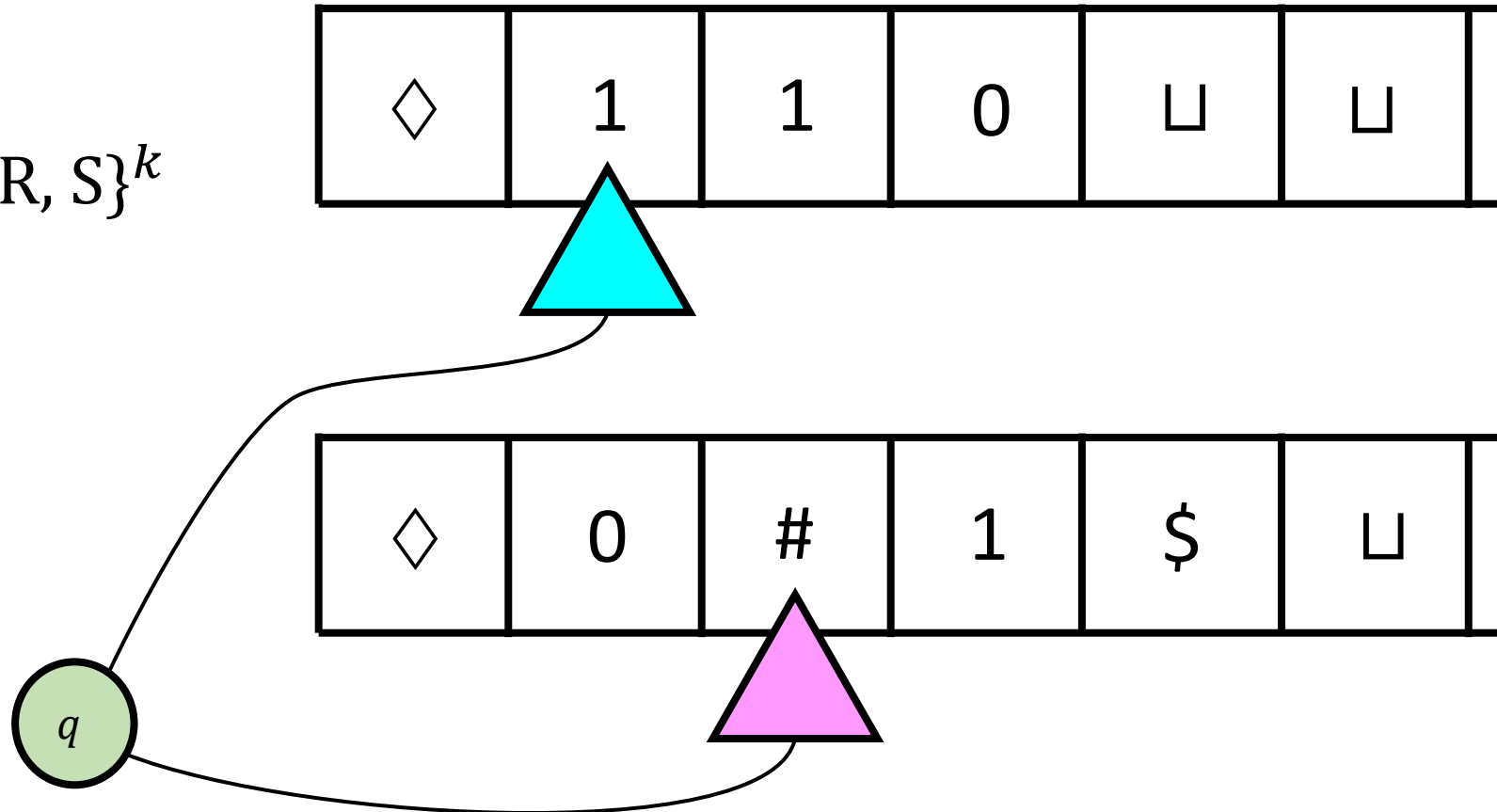
← Mathematically precise notion

# Multi-tape Turing machines

- “ $k$ -tape TM”

- Transition function:

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



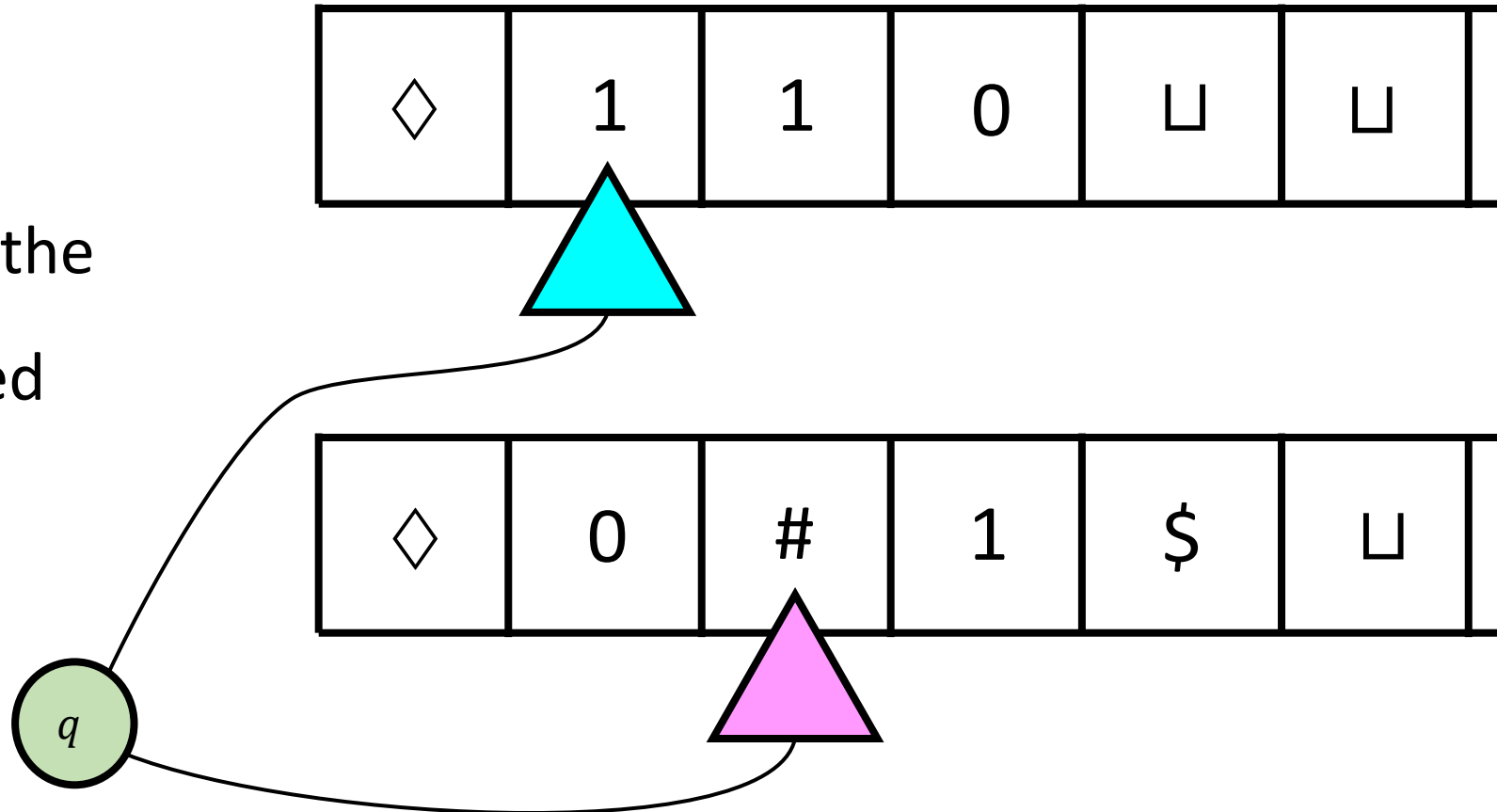
# Multi-tape Turing machines

- Let  $k$  be any positive integer and let  $L$  be a language

**Theorem:** There exists a  $k$ -tape TM that decides  $L$  if and only if there exists a 1-tape TM that decides  $L$

# Simulating $k$ tapes with 1 tape

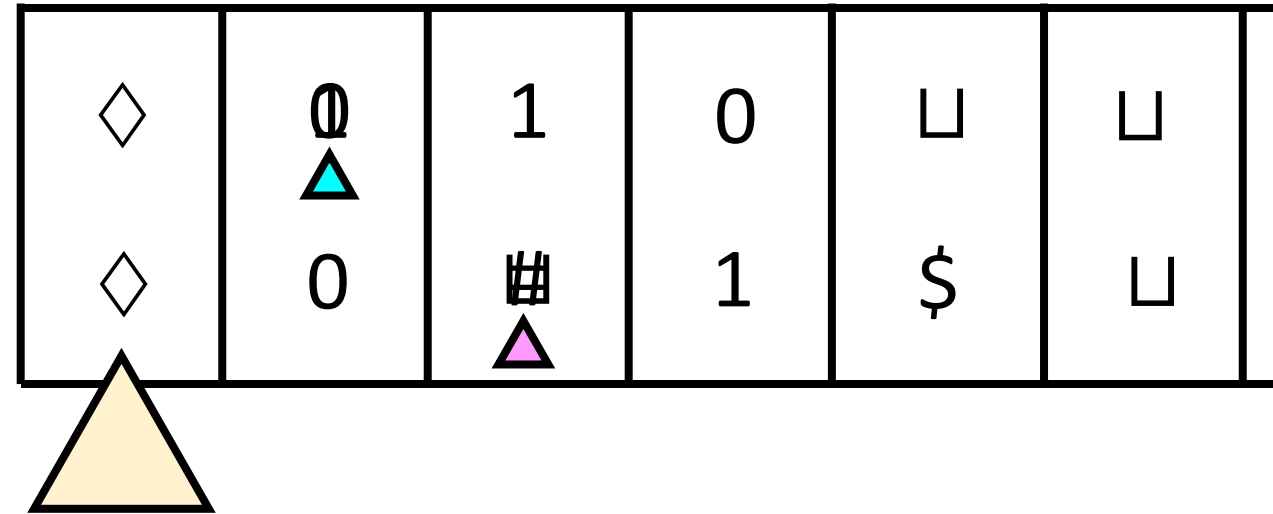
- Idea: Pack a bunch of data into each cell
- Store “simulated heads” on the tape, along with  $k$  “simulated symbols” in each cell



# Simulating $k$ tapes with 1 tape

- Idea: Pack a bunch of data into each cell

- Store “simulated heads” on the tape, along with  $k$  “simulated symbols” in each cell



- The **one “real head”** will scan back and forth, updating the simulated heads’ locations and the simulated tape contents. (Details on the next slides)

# Simulating $k$ tapes with 1 tape

- Let  $M = (Q, \Sigma, \Gamma, \diamond, \sqcup, \delta, q_0, q_{\text{accept}}, q_{\text{reject}})$  be a  $k$ -tape Turing machine that decides  $L$
- We will define a 1-tape Turing machine

$$M' = (Q', \Sigma, \Gamma', \diamond, \sqcup, \delta', q'_0, q_{\text{accept}}, q_{\text{reject}})$$


that also decides  $L$

# Simulating $k$ tapes with 1 tape: Alphabet

- Let  $\Lambda = \Gamma \cup \{\underline{b} : b \in \Gamma\}$ , i.e., two disjoint copies of  $\Gamma$ 
  - Interpretation: An underline indicates the presence of a **simulated head**
- New alphabet:  $\Gamma' = \{\diamond, \sqcup\} \cup \left\{ \begin{pmatrix} b_1 \\ \vdots \\ b_k \end{pmatrix} : b_1, \dots, b_k \in \Lambda \right\}$ 
  - Interpretation: One symbol in  $\Gamma'$  is one “simulated column” of  $M$
- Identify each input symbol  $b \in \Sigma$  with the new symbol  $\begin{pmatrix} b \\ \sqcup \\ \vdots \\ \sqcup \end{pmatrix}$ , so  $\Sigma \subseteq \Gamma'$



# Simulating $k$ tapes with 1 tape: Head statuses

- At each moment, each simulated head will have one of the following statuses:
  - “ $\rightarrow b, D$ ” where  $b \in \Gamma$  and  $D \in \{L, R, S\}$ 
    - Interpretation: The simulated head needs to write  $b$  and move in direction  $D$
  - “”
    - Interpretation: The simulated head is not currently depicted on the real tape; the simulated head’s location is currently the same as the real head’s location
  - “ $b \rightarrow$ ” where  $b \in \Gamma$ 
    - Interpretation: In the next simulated step, the simulated head will read  $b$

# Simulating $k$ tapes with 1 tape: Head statuses

- Let  $\Omega$  be the set of all possible statuses for a single simulated head:

$$\Omega = \{ " \rightarrow b, D " : b \in \Gamma, D \in \{L, R, S\} \}$$

$$\cup \{ " \text{👤} " \}$$

$$\cup \{ " b \rightarrow " : b \in \Gamma \}$$

# Simulating $k$ tapes with 1 tape: States

- New state set:

$$Q' = \{q_{\text{accept}}, q_{\text{reject}}\} \cup \left\{ \left( \begin{array}{c} s_1 \\ \vdots \\ s_k \end{array} \right)_{q,D} : s_1, \dots, s_k \in \Omega; \quad q \in Q; \quad D \in \{L, R\} \right\}$$

- Interpretation:

- Simulated head  $j$  has status  $s_j$
- The simulated machine is in state  $q$
- The one real head is making a pass over the tape in direction  $D$

# Simulating $k$ tapes with 1 tape: Start state

- New start state:

$$q'_0 = \left( \begin{array}{c} \text{"} \text{🐧} \text{"} \\ \vdots \\ \text{"} \text{🐧} \text{"} \end{array} \right)_{q_0, R}$$

# Simulating $k$ tapes with 1 tape: Transitions

- The new transition function will have the form

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

# Simulating $k$ tapes with 1 tape: Transitions

- Let  $\delta' \left( \left( \begin{matrix} s_1 \\ \vdots \\ s_k \end{matrix} \right)_{q,D}, \left( \begin{matrix} b_1 \\ \vdots \\ b_k \end{matrix} \right) \right) = \left( \left( \begin{matrix} s'_1 \\ \vdots \\ s'_k \end{matrix} \right)_{q,D}, \left( \begin{matrix} b'_1 \\ \vdots \\ b'_k \end{matrix} \right), D \right)$  where  $s'_j, b'_j$  are defined by:
  - If  $s_j = \text{“}\langle \text{”}$ :  
Let  $b'_j = \underline{b_j}$  and  $s'_j = \text{“}b_j \rightarrow\text{”}$
  - If  $s_j = \text{“}\rightarrow c_j, S\text{”}$  and  $b_j$  has an underline:  
Let  $b'_j = \underline{c_j}$  and  $s'_j = \text{“}c_j \rightarrow\text{”}$
  - If  $s_j = \text{“}\rightarrow c_j, D\text{”}$  and  $b_j$  has an underline:  
Let  $b'_j = c_j$  and  $s'_j = \text{“}\langle \text{”}$
  - In all other cases:  
Let  $b'_j = b_j$  and  $s'_j = s_j$

# Simulating $k$ tapes with 1 tape: Transitions

• Let  $\delta' \left( \begin{pmatrix} s_1 \\ \vdots \\ s_k \end{pmatrix}_{q,R}, \sqcup \right) = \left( \begin{pmatrix} s'_1 \\ \vdots \\ s'_k \end{pmatrix}_{q,L}, \begin{pmatrix} b'_1 \\ \vdots \\ b'_k \end{pmatrix}, L \right)$  where  $s'_j, b'_j$  are defined by:

• If  $s_j = \text{“} \textcircled{\text{R}} \text{”}$ :                      Let  $b'_j = \underline{\sqcup}$                       and  $s'_j = \text{“} \sqcup \rightarrow \text{”}$

• In all other cases:                      Let  $b'_j = \sqcup$                       and  $s'_j = s_j$

# Simulating $k$ tapes with 1 tape: Transitions

- What do we do when we see  $\diamond$ ? Let  $s_1, \dots, s_k \in \Omega$  (head statuses) and let  $q \in Q$
- Assume that  $\forall j$ , either  $s_j = "b_j \rightarrow "$  or  $s_j = "\text{robot}"$ . In the latter case, let  $b_j = \diamond$
- Let  $(q', c_1, \dots, c_k, D_1, \dots, D_k) = \delta(q, b_1, \dots, b_k)$
- If  $s_j = "b_j \rightarrow "$ , let  $s'_j = " \rightarrow c_j, D_j"$ . If  $s_j = "\text{robot}"$ , let  $s'_j = "\text{robot}"$

- Let  $\delta' \left( \left( \begin{matrix} s_1 \\ \vdots \\ s_k \end{matrix} \right)_{q,L}, \diamond \right) = q'$  if  $q'$  is a halting state and  $\left( \left( \begin{matrix} s'_1 \\ \vdots \\ s'_k \end{matrix} \right)_{q',R}, \diamond, R \right)$  otherwise



# Simulating $k$ tapes with 1 tape

- That completes the definition of  $M'$
- Exercise: Rigorously prove that  $M'$  decides  $L$

# TMs can simulate all “reasonable” machines

- We could add various **other bells and whistles** to the basic TM model
  - The ability to observe the two neighboring cells
  - A tape that extends infinitely in both directions
  - A two-dimensional tape
- **None of these changes has any effect** on the power of the model

# The Church-Turing Thesis

- Let  $L$  be a language

## **Church-Turing Thesis:**

There exists an “algorithm” / “procedure” for figuring out whether a given string is in  $L$  if and only if there exists a Turing machine that decides  $L$ .

← Intuitive notion

← Mathematically precise notion

# Are Turing machines powerful enough?

- **OBJECTION:** “To encompass all possible algorithms, the model would need to be as powerful as high-level programming languages, such as `Python`.”
- **RESPONSE:** I claim that if there exists a Python script that decides  $L$ , then there exists a Turing machine that decides  $L$
- We won't actually `prove` this claim, but let's briefly `discuss the process` of converting Python code to Turing machines

```
1  # Assumption: x, y, z are
2  # nonnegative integers
3  def f(x, y, z):
4      r = 0
5      while (r < y):
6          r = r + x
7      return (r < z)
```

# Step 1: Operate at the level of individual bits

```
1 # Assumption: x, y, z are
2 # nonnegative integers
3 def f(x, y, z):
4     r = 0
5     while (r < y):
6         r = r + x
7     return (r < z)
```

⇓

```
1 # Assumption: x, y, z are
2 # lists of bits starting with
3 # the *least* significant
4 def f(x, y, z):
5     r = [0]
6     while (lessThan(r, y)):
7         addTo(x, r)
8     return lessThan(r, z)
```

```
9 def lessThan(x, y):
10     i = max(len(x) - 1, len(y) - 1)
11     while i >= 0:
12         # Assumption: IndexError ⇒ 0
13         if (x[i] < y[i]): return True
14         if (x[i] > y[i]): return False
15         i = i - 1
16     return False
17
18 def addTo(x, y):
19     c = 0
20     for i in range(max(len(x), len(y))):
21         # Assumption: IndexError ⇒ 0
22         b = x[i] ^ y[i] ^ c
23         c = (x[i] & y[i]) | (x[i] & c)
24             | (y[i] & c)
25         y[i] = b
26     y.append(c)
```

# Step 2: Eliminate subroutines

```
1 # Assumption: x, y, z are
2 # lists of bits starting with
3 # the *least* significant
4 def f(x, y, z):
5     r = [0]
6     while (lessThan(r, y)):
7         addTo(x, r)
8     return lessThan(r, z)
```

⇒

```
1 def f(x, y, z):
2     r = [0]
3     whileCondition = False
4     i = max(len(r) - 1, len(y) - 1)
5     while i >= 0:
6         if (r[i] < y[i]):
7             whileCondition = True
8             break
9         if (r[i] > y[i]):
10            whileCondition = False
11            break
12        i = i - 1
13    if (whileCondition):
14        c = 0
15        for i in range(max(len(x), len(r))):
16            b = x[i] ^ r[i] ^ c
17            c = (x[i] & r[i]) | (x[i] & c)
18                | (r[i] & c)
19            r[i] = b
20        r.append(c)
21        whileCondition = False
22        i = max(len(r) - 1, len(y) - 1)
23        while i >= 0:
24            if (r[i] < y[i]):
25                whileCondition = True
26                break
27            if (r[i] > y[i]):
28                whileCondition = False
29                break
30            i = i - 1
31    i = max(len(r) - 1, len(z) - 1)
32    while i >= 0:
33        if (r[i] < z[i]): return True
34        if (r[i] > z[i]): return False
35        i = i - 1
36    return False
```

# Step 3: From code to Turing machines

- Basic idea:
  - Variable  $\Rightarrow$  **Tape** (assuming the variable holds a list of bits)
  - List index  $\Rightarrow$  **Head**
  - Line of code  $\Rightarrow$  **State**

# Step 3: From code to Turing machines

```
⋮
3   whileCondition = False
4   i = max(len(r) - 1, len(y) - 1)
5   while i >= 0:
6       if (r[i] < y[i]):
7           whileCondition = True
8           break
9       if (r[i] > y[i]):
10          whileCondition = False
11          break
12          i = i - 1
13  if (whileCondition):
14  ...
⋮
```

⇒

- State “4”:
  - If the “r” head and the “y” head both see  $\sqcup$ , move them both to the left and go to state “5”.
  - Otherwise, move those heads to the right and go to state “4”.
- State “5”:
  - If the “r” head sees 0 or  $\sqcup$  and the “y” head sees 1, go to state “14”.
  - If the “r” head sees 1 and the “y” head sees 0 or  $\sqcup$ , go to state “31”.
  - If the “r” head and the “y” head see  $\diamond$ , go to state “31”.
  - Otherwise, move those heads to the left and go to state “5”.



# Turing machines as a programming language

- You can think of the Turing machine model as a primitive programming language