

# CS 121: Lecture 10

## Turing Machines

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# Announcements:

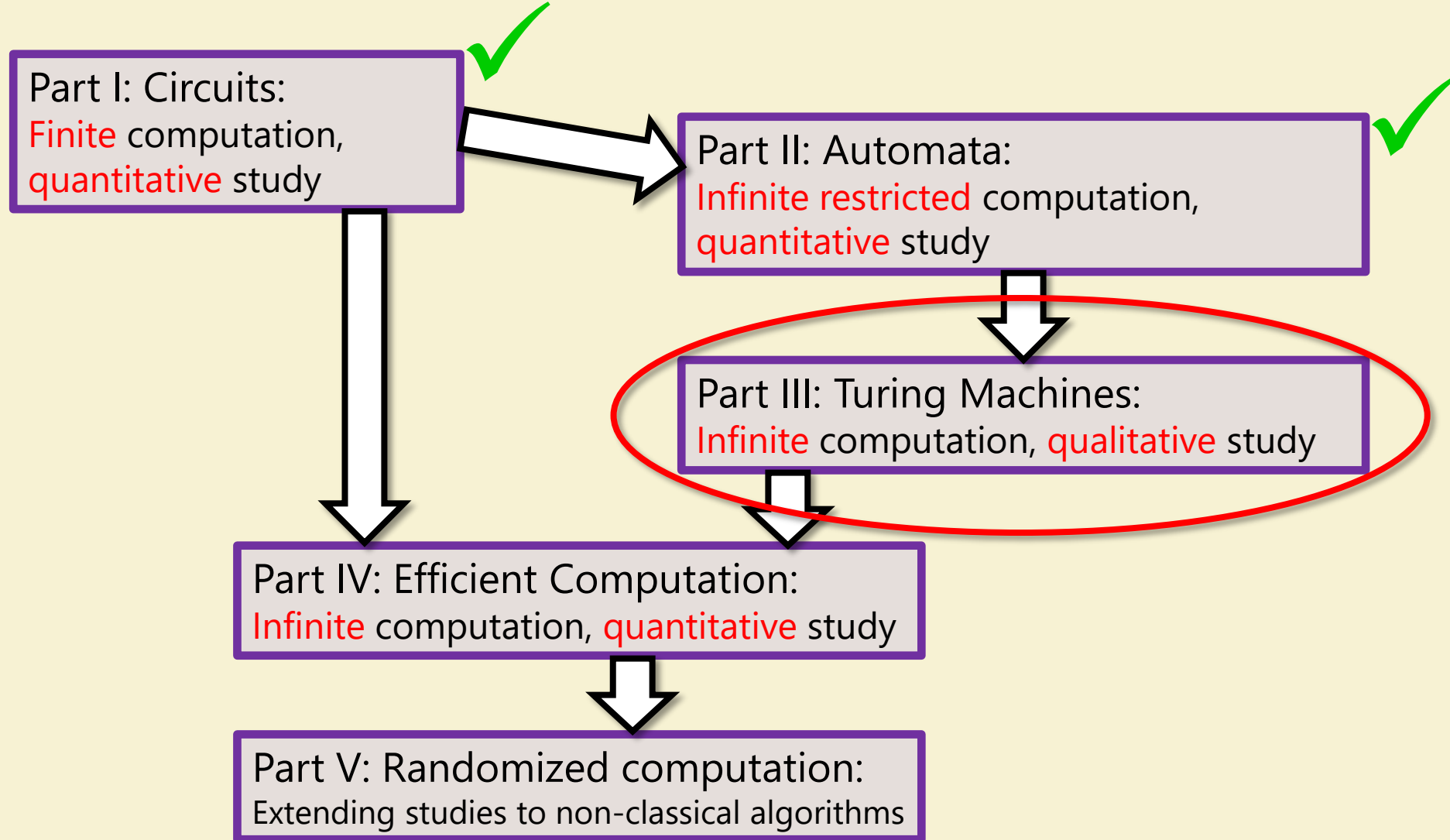
- Midterm 1 next week:
  - Logistics announcement by Thursday
  - Prep Material: Canvas → Files → Midterm Prep
  - ~~likely~~ 2 pages of typset cheatsheet allowed. No other external refs.
- Homework 3 due Thursday

- Advanced Sections: Christina Ilvento on Differential Privacy!

Thursdays at 4:30.



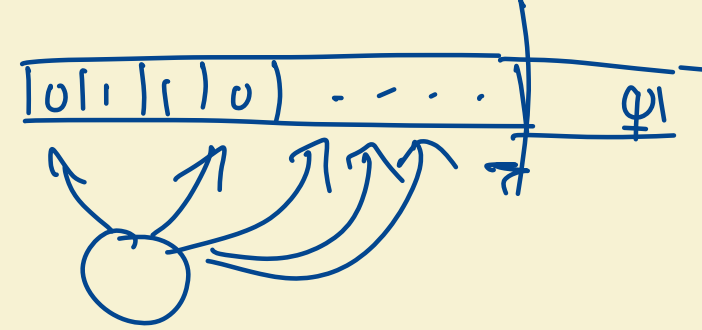
# Where we are:



# Today:

- Definition of Turing Machines
- A function  $F$  not computable by DFA or Circuits
- Computing  $F$  with Turing Machine

# Definition of Turing Machine (TM)



- Recall: DFA = Finite state control + input on tape + move right on each step.

- In a nutshell: TM = DFA + "Write" + "Move left+right on tape"

- (Either "Write" / "Move left+right" on its own insufficient)

$$\text{DFA: } T: [C] \times \{0,1\} \rightarrow [C]$$

- TM: Main change:

$$\delta: [R] \times \Sigma \longrightarrow [R] \times \Sigma \times \{L, R, S, H\}$$

Write  
↓

- More Involved Transition function:  $T$  (now  $\delta$ ):

- $\delta: (\text{current state, read symbol}) \mapsto (\text{new state, write symbol, direction of move/halt})$

- Explicit halting (don't just end after reading last input bit)

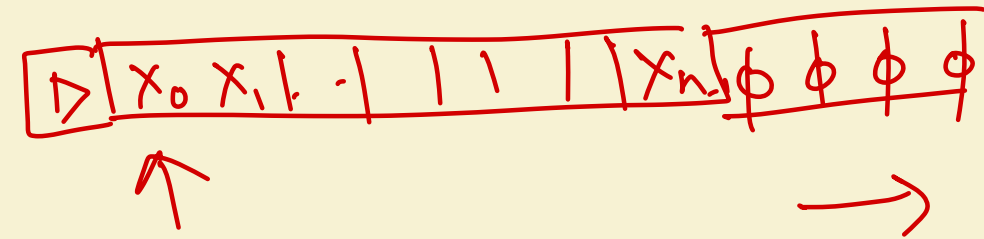
- Computes functions: output = concatenation of  $\{0,1\}$  symbols on tape.

# Formal Definition

$$\text{States} = \{0, \dots, k-1\}$$

↑  
start

- (Barak, Definition 7.1):
- TM on  $k$  states and alphabet  $\Sigma \supseteq \{0, 1, \triangleright, \phi\}$  is given by  $\delta: [k] \times \Sigma \rightarrow [k] \times \Sigma \times \text{Action}$ , where  $\text{Action} = \{L, R, S, H\}$ 
  - $L$ =Left,  $R$ =Right,  $S$ =Stay (don't move),  $H$ =Halt (done!!)
- Operation:
  - Start in state 0, Tape  $T = \triangleright x_0 \dots x_{n-1} \phi \phi \phi \dots$ , Head ( $i$ ) at  $x_0$
  - General step: current state  $q$ ; input symbol  $\sigma$ :  
Let  $\delta(q, \sigma) = (r, \tau, X) \Rightarrow$  Write  $\tau$  on tape (overwriting  $\sigma$ ); Move to state  $r$ ;  
Move Head left ( $i \leftarrow i - 1$ ) if  $X = L$ ; right if  $X = R$ ; don't move if  $X = S$ .
  - Repeat General step until  $X = H$



$$x_0 \dots x_{n-1} \in \{0, 1\}$$
$$\Downarrow$$
$$\text{input} \in \Sigma_{0,1}^*$$

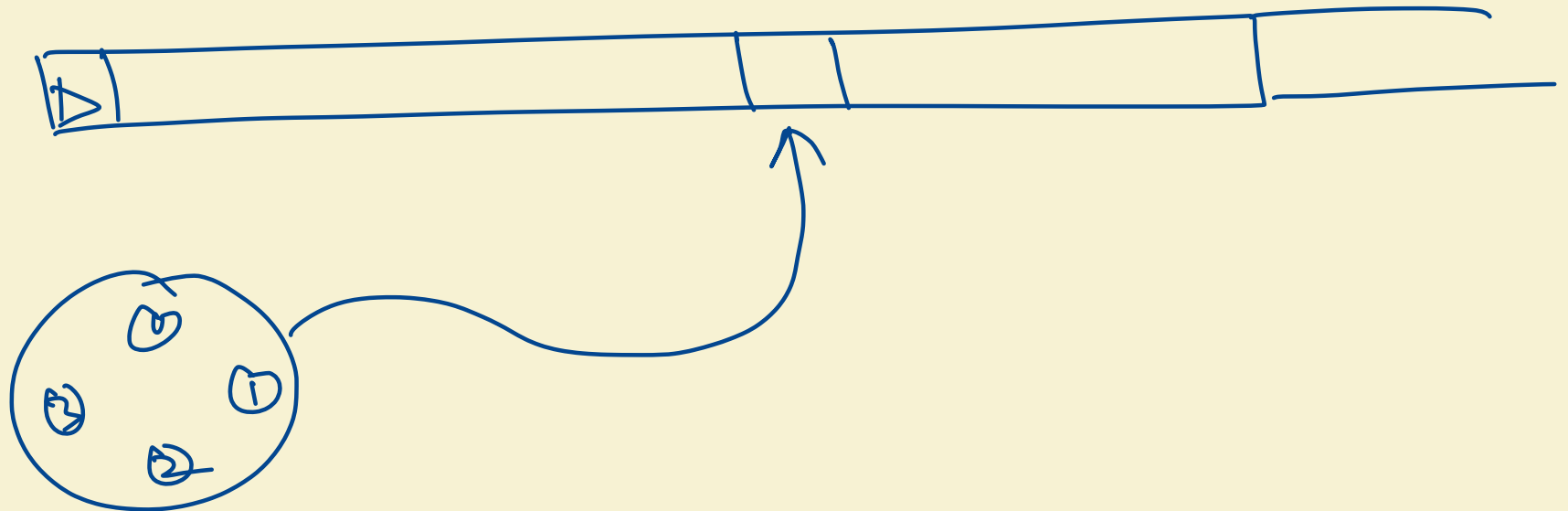
# TM Example

nextState      symbol we write      Action of Tape Head

$\delta(0, \sigma) = \begin{cases} (0, 0, R) & \text{if } \sigma \in \{0, 1\} \\ (0, \phi, H) & \text{if } \sigma \notin \{0, 1\} \end{cases}$       End/Halt

- Example:  $k = 1$ ;  $\Sigma = \{0, 1, \triangleright, \phi\}$ ;  $\delta(0, \sigma) = \begin{cases} (0, 0, R) & \text{if } \sigma \in \{0, 1\} \\ (0, \phi, H) & \text{if } \sigma \notin \{0, 1\} \end{cases}$
- What does TM output on  $\triangleright 101\phi \dots$  (in future, we won't write  $\triangleright$  or  $\phi$ )

Output = 000



# TM Example

- Example:  $k = 1$ ;  $\Sigma = \{0, 1, \triangleright, \phi\}$ ;  $\delta(0, \sigma) = \begin{cases} (0, 0, R) & \text{if } \sigma \in \{0, 1\} \\ (0, \phi, H) & \text{if } \sigma \notin \{0, 1\} \end{cases}$

- What does TM output on  $\triangleright 101\phi \dots$  (in future, we won't write  $\triangleright$  or  $\phi$ )

- What function does TM compute?

$$0 \triangleright A \mid \mid B \mid 0 \Rightarrow 01110$$

Def: Output of Turing Machine = Concatenation of 0s & 1s  
on tape.



# A "hard" function

- $f: \{0,1\}^* \rightarrow \{0,1\}$ ,  $f(x) = 1 \Leftrightarrow x = 1^n$  for  $n = 2^t$  for integer  $t$

$$f(0) = 0$$

$$f(1) = 1$$

$$f(1^2) = 1$$

$$f(1^{256}) = 1$$

$$f(1^{200}) = 0$$

# Exercise Break 1

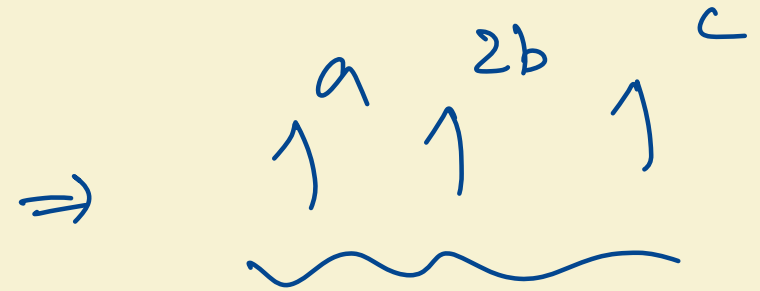
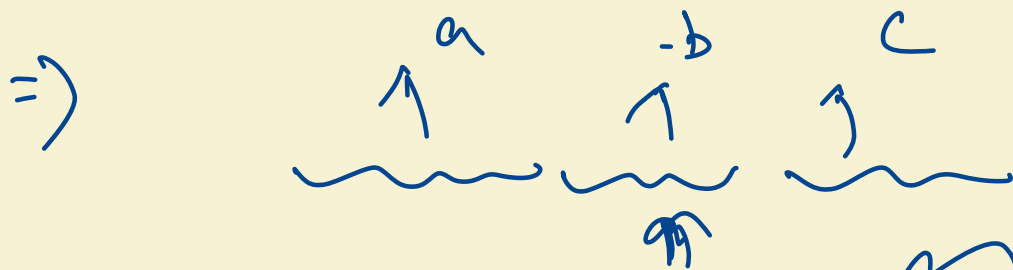
- $f: \{0,1\}^* \rightarrow \{0,1\}$ ,  $f(x) = 1 \Leftrightarrow x = 1^n$  for  $n = 2^t$  for integer  $t$
- (30 sec) Prove that no circuit computes  $f$
- (4 min 30 sec) Prove no DFA computes  $f$ 
  - Part 1: Focus on big idea; defer calculations/parameter settings.
  - Part 2: Get your hands dirty; do calculations+parameter settings.

if length of input is  $2^t$

& Reg. exp<sup>e</sup> has length 2

then  $\rightarrow$  must be a star in e;

$$[q < 2^t]$$



$$a + b + c = 2^t \Rightarrow$$

matches  $\star$

$$f(\uparrow^{a+b+c}) = 1$$

$$f(\uparrow^{a+2b+c}) = 1$$

DFA has  $C$  states



$x < y$

if  $\exists x \neq y$  st.

$$q_x = q_y$$

$$\begin{aligned} & \rightarrow \uparrow^y \cdot \uparrow^z = \uparrow^{2^t} \\ & \uparrow^x \cdot \uparrow^2 = \uparrow^{\underbrace{2^t + x - y}} \end{aligned}$$

Hint:  $t = 2^y - y$

Can prove that

$2^y + x - y$  is

not a power of 2.

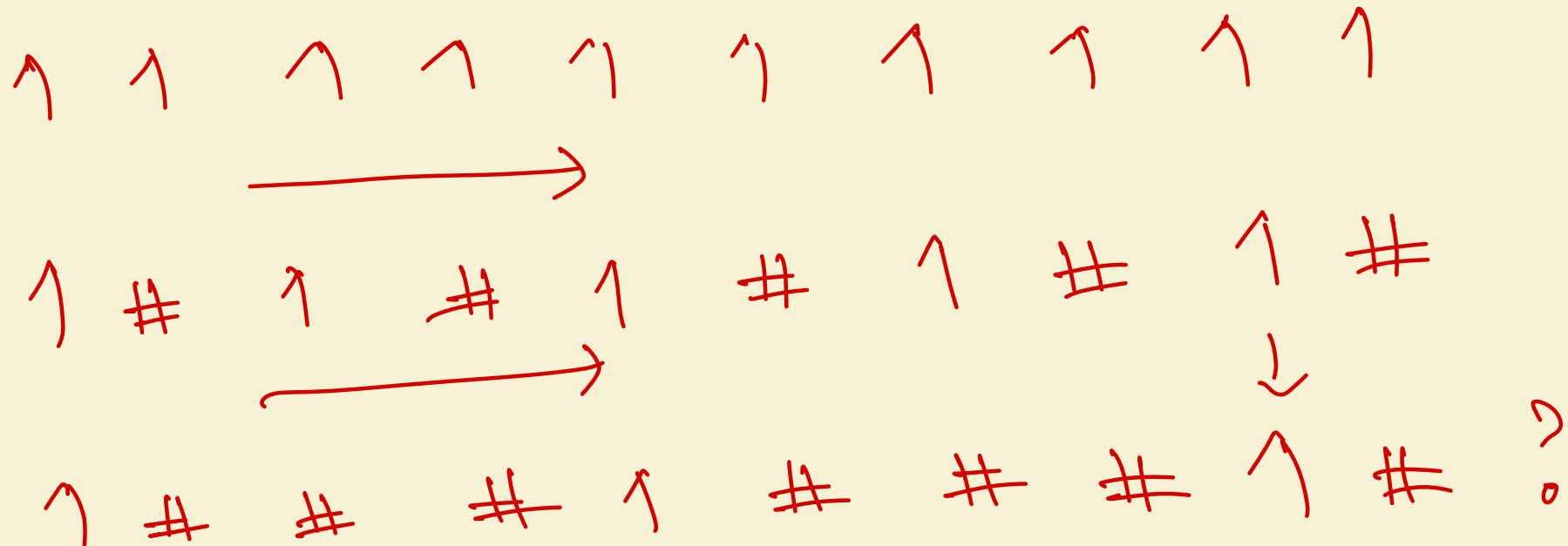
# F is computable by a Turing Machine

Main Idea: Loop many times:

Scan string left to right

Replace every alternate 1 by 0;

reject if number of 1s is odd and greater than 2.



- Say  $\exists$  DFA with  $C$  states computing  $f$ .

-  $q_i \triangleq$  state after input  $1^i$ ,  $i = 0, 1, 2, \dots, C+1, \dots$

$\exists 1 \leq x < y \leq C+1$  s.t.

$$q_x = q_y$$

$$z = 2^y - y$$

$$2^y - y + x \neq 2^t$$

for any  $t$

$\left\{ \begin{array}{l} 1^x \cdot 1^z \\ 1^y \cdot 1^z \end{array} \right. \Rightarrow$  must reject

$= 1^{2^y} \Rightarrow$  must accept.

# More details: Alphabet & States

Alphabet  $\Sigma = \{0, 1, \triangleright, \phi, \#\}$

0. Start/Not seen any ones

1. Move Right first one  $\leftarrow$

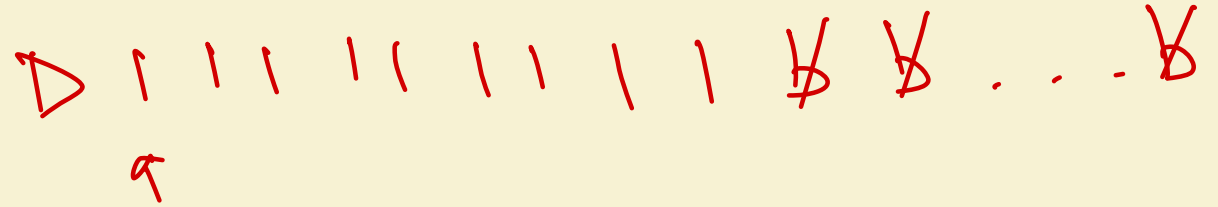
2. Move Right even # of ones  $\leftarrow$

3. Move Right odd # of ones  $\leftarrow$

4. Move Left  $\leftarrow$

5. Clean Right and Reject

6. Clean Left and Reject



after seeing one 1  
 $\leftarrow$  after seeing even # of 1s  
 $\leftarrow$  after seeing an odd > 2 # of 1s.



Input  $\triangleright$  1 1 0 1 1 1 1 1

↑      ↑

→ State 0, 1, 2 → clean right & reject

↙

$\triangleright$  1 1 0 # # # # # # ~~1~~

↓ ↓ ↓

$\triangleright$  # # # # # # # # 0

↑

↺

halt      Clean left & reject

Alphabet  $\Sigma = \{0, 1, \triangleright, \phi, \#\}$

0. Start/Not seen any ones
1. Move Right first one
2. Move Right even # of ones
3. Move Right odd # of ones
4. Move Left
5. Clean Right and Reject
6. Clean Left and Reject

State/Input	$\triangleright$	0	1	$\phi$	#
0	invalid	(5, #, R)	(1, 1, R)	(6, 0, L)	(0, #, R)
1	invalid				
2	invalid				
3	invalid				
4	(0, $\triangleright$ , R)				
5					
6	(- $\triangleright$ , H)				

$f: \{0,1\}^* \rightarrow \{0,1\}$ ,  $f(x) = 1 \Leftrightarrow x = 1^n$  for  $n = 2^t$  for integer  $t$

State/Input	▷	0	1	ϕ	#
0					
1					
2					
3					
4					
5					
6					

Alphabet  $\Sigma = \{0,1,\triangleright,\phi,\#\}$

0. Start/Not seen any ones
1. Move Right first one
2. Move Right even # of ones
3. Move Right odd # of ones
4. Move Left
5. Clean Right and Reject
6. Clean Left and Reject

## Exercise Break 2:

Fill in rows for states 2 & 4

Keep answer ready (5 triples)  
to type into chat. Use D for ▷

Alphabet  $\Sigma = \{0,1,\triangleright,\phi,\#\}$

0. Start/Not seen any ones
1. Move Right first one
2. Move Right even # of ones
3. Move Right odd # of ones
4. Move Left
5. Clean Right and Reject
6. Clean Left and Reject

State/Input	$\triangleright$	0	1	$\phi$	#
0	invalid	(5,#,R)	(1,1,R)	(-,0,H)	(0,#,R)
1	invalid	(5,#,R)	(2,#,R)	(-,#,H)	(1,#,R)
2	invalid	(5,#,R)	<del>(3,#,R)</del> (3,1,R)	(4, $\phi$ ,L)	(2,#,R)
3	Invalid	(5,#,R)	(2,1,R) (2,#,R)	(6,0,L) ...	(3,#,R)
4	(0, $\triangleright$ ,R)	invalid	(4,1,L)	invalid	(4,#,L)
5	invalid	(5,#,R)	(5,#,R)	(6,0,L)	(5,#,R)
6	(-, $\triangleright$ ,H)	invalid	(6,#,L)	invalid	(6,#,L)

# Summary & Next

- Achieved today:
  - Defined TM
  - Shown it computes one function that DFA and circuits can't
- Next Lecture:
  - More examples.
  - Towards equivalence with (all) programs