

# CS3102 Theory of Computation

Warm up:  
How do I know  $X$  isn't in the list?

$\mathbb{N}$	$\mathbb{R}$
$f(1) =$	3 . 1 4 1 5 9 2 6 5 3 ...
$f(2) =$	1 . 0 0 0 0 0 0 0 0 0 ...
$f(3) =$	2 . 7 1 8 2 8 1 8 2 8 ...
$f(4) =$	1 . 4 1 4 2 1 3 5 6 2 ...
$f(5) =$	0 . 3 3 3 3 3 3 3 3 3 ...
...	...

$X = 0.21934\dots \in \mathbb{R}$

# Take-away Ideas

- All finite sets are countable
- Anything with a bijection to the naturals is countable
- A subset of a countable set is countable
- A union of countably many sets is countable
  - Formal proof of this is homework
- To be computable by Java, the set of possibilities must be countable!

# Are the Real Numbers Countable?

- Things that don't work:
  - List out every real number that starts with 1, then 2, then 3, ...
  - List out every real number that has one number after the decimal, then 2, then 3, ...
- How would we prove it wasn't?

# Diagonalization

- Used to prove that a set is not countable
  - Shows that there cannot be a bijection with the Natural Numbers
- 1. Assume toward a contradiction there is a bijection with the natural numbers
- 2. Treat this arbitrary bijection as an ordered list containing all items (item 0 is the thing which maps to 0, etc.)
- 3. Show that this list must always be missing something

# Diagonalization

Assume toward a contradiction that  $f: \mathbb{N} \leftrightarrow \mathbb{R}$ , show that  $f$  cannot be onto (something from  $\mathbb{R}$  is not mapped to)

$\mathbb{N}$	$\mathbb{R}$
$f(1) =$	3 . <b>1</b> 4 1 5 9 2 6 5 3 ...
$f(2) =$	1 . 0 <b>0</b> 0 0 0 0 0 0 ...
$f(3) =$	2 . 7 1 <b>8</b> 2 8 1 8 2 8 ...
$f(4) =$	1 . 4 1 4 <b>2</b> 1 3 5 6 2 ...
$f(5) =$	0 . 3 3 3 3 <b>3</b> 3 3 3 3 ...
...	...

$X = 0 . 2 \ 1 \ 9 \ 3 \ 4 \ \dots \in \mathbb{R}$

This number  $X$  cannot appear anywhere in the list.  
It's different from each  $f(i)$  at digit  $i$

# Is the set of all Languages Countable?

$\mathbb{N}$	$\varepsilon$	$a$	$b$	$aa$	$ab$	$ba$	$bb$	$aaa$	...			
$f(1) =$	1	1	1	1	1	1	1	1	1	1	...	
$f(2) =$	1	0	1	0	1	0	1	0	1	0	1	...
$f(3) =$	0	1	0	1	0	1	0	1	0	1	0	...
$f(4) =$	1	1	0	1	1	0	1	1	0	1	1	...
$f(5) =$	0	0	0	1	0	0	1	1	1	0	1	...
...	...											
$L =$	0	1	1	0	1	...						

Each row represents a language which includes string  $i$  provided column  $i$  has a 1

This Language  $L$  cannot appear anywhere in the list. It's different from each  $f(i)$  because its containment of string  $i$  is opposite

# Correlary

- Some languages cannot be decided by Java

# Another Correlary

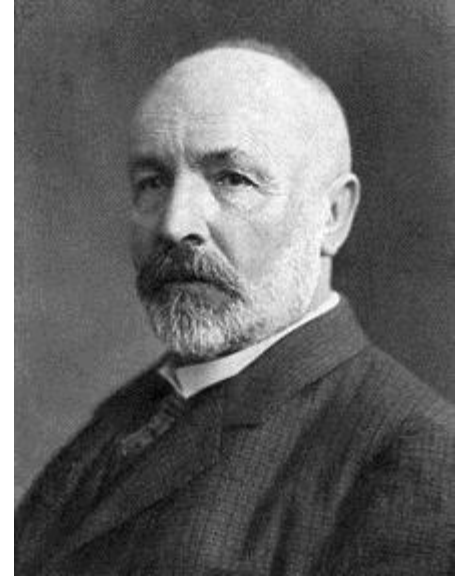
- Some languages have no finite description!



# Yet Another Correlary

- Some languages (problems) cannot be described!
- Can any of these be decided by Java?

# Cantor's Theorem



- For any set  $S$ ,  $|2^S| < S$ 
  - Holds when  $S$  is finite (homework)
  - What about when  $S$  is infinite?
  - If  $S$  is countably infinite: diagonalization
- Assume toward contradiction we have  $f: S \leftrightarrow 2^S$ 
  - Let  $T = \{x \in S \mid x \in f(x)\}$
  - Note that  $T \subseteq S$ , so there must be some  $x_t$  s.t.  $f(x_t) = T$
  - Is  $x_t \in T$ ?

# Continuum Hypothesis

- We know that  $|\mathbb{N}| < |\mathbb{R}|$
- Is there a set  $S$  s.t.  $|\mathbb{N}| < |S| < |\mathbb{R}|$ ?
- Answer:
  - Unanswerable

# Godel's Incompleteness Theorem

- Says any axiomatic system is at least one of:
  1. **Inconsistent:** There are false things that you can prove
  2. **Incomplete:** There are true things that you cannot prove
  3. **Weak:** You can't talk about prime numbers
- Proof idea: Show that any system can construct the paradox "This statement cannot be proven"

# Incompleteness in CS\*

- Expectation Maximization Problem
  - You want to put ads on your website
  - You don't know yet who will visit your website
  - Select ads to maximize the maximum number of potential customers
- Answering this problem requires “tools” not yet addressed by set theory!

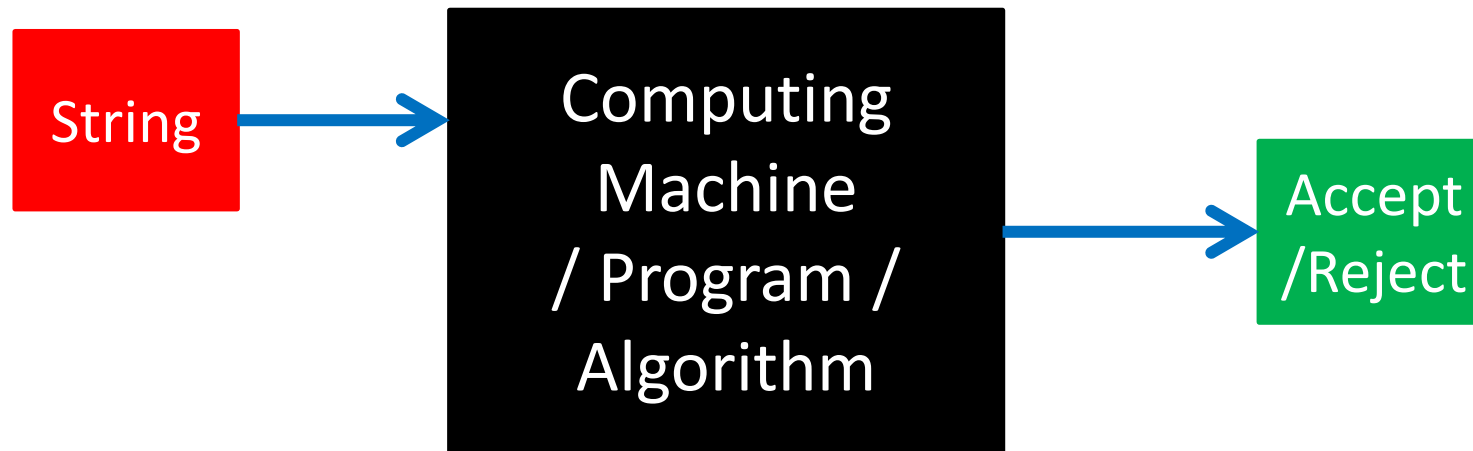
\* <https://www.nature.com/articles/s42256-018-0002-3>

# End of Phase 1

- Until now:
  - Mathematical foundations
  - Proof strategies
  - Key ideas/insights
  - Main takeaway: Some languages (and numbers) cannot be computed by Java (or anything else)
    - Why? There are more language (numbers) than there are Java programs (or even finite descriptions)

# Phase 2

- Now we start filling in this box
  - First option: finite state machine



# Operations on Strings

- Length
  - $|s|$  = Number of characters in the string  $s$
  - $|Ringo| = 5$
- Concatenation
  - $s \cdot t = st$  = string which has all of the characters from  $s$  followed by all of the characters from  $t$
  - $John \cdot Paul = JohnPaul$
  - $|s \cdot t| = |s| + |t|$
- Exponentiation
  - $s^k$  = The string created by concatenation  $s$  with itself  $k$  times
  - $(George)^5 = GeorgeGeorgeGeorgeGeorgeGeorge$
  - $|s^k| = |s| \cdot k$



# Empty String ("")

- Notation for this class:  $\varepsilon$ 
  - `\varepsilon` in Latex
- $|\varepsilon| = 0$
- $S \cdot \varepsilon = S$
- $\varepsilon^k = \varepsilon$
- $S^0 = \varepsilon$

# Operations on Languages

- Everything we can do on sets ( $\cup, \cap, -, \dots$ )
- Concatenation
- Exponentiation
- Kleene Closure

# Language Concatenation

- $L_1 \cdot L_2$  or  $L_1 L_2$ 
  - Notation is the same as string concatenation
  - Every possible way to concatenate a string from  $L_1$  with a string from  $L_2$  (in that order)
  - Idea: take  $L_1 \times L_2$  and concatenate the strings that are paired
  - $\{john, paul\} \cdot \{george, ringo\} = \{johngeorge, jonringo, paulgeorge, paulringo\}$
  - $|L_1 L_2| \leq |L_1 \times L_2|$
  - $\{a, aa, aaa\} \cdot \{a, aa\} = \{aa, aaa, aaaa, aaaaa\}$

# Language Exponentiation

- $L^k$ 
  - $L$  concatenated with itself  $k$  times
  - $L^5 = L \cdot L \cdot L \cdot L \cdot L$
  - $\{a, b\}^3 =$   
 $\{aaa, aab, aba, abb, baa, bab, bba, bbb\}$
  - $L^0 = \{\varepsilon\}$

# Kleene Closure

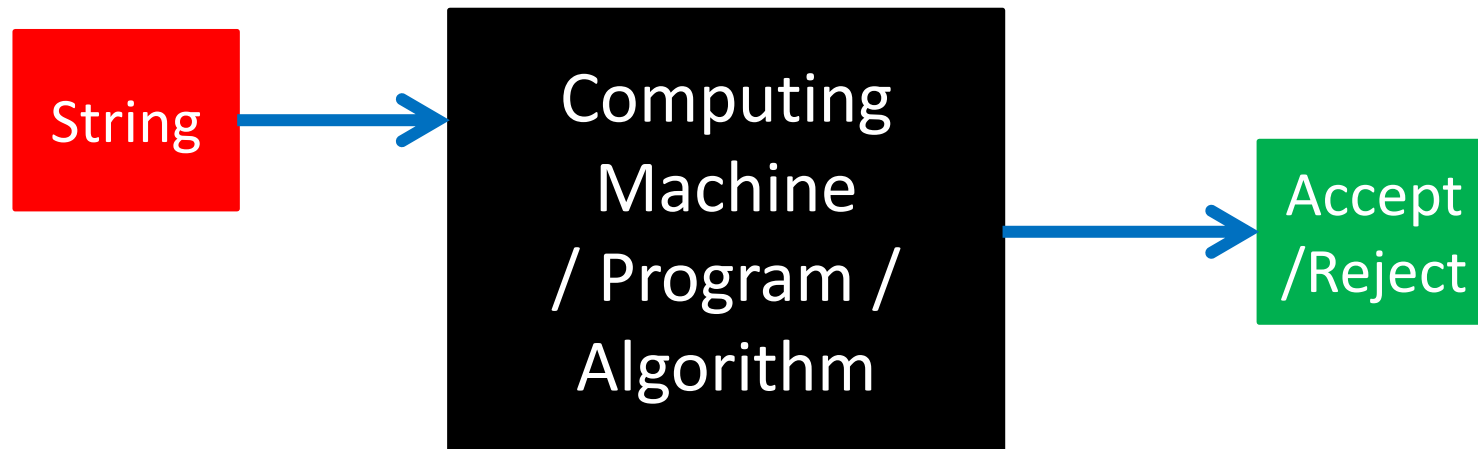
- $L^*$ 
  - $L$  concatenated with itself 0 or more times
  - $L^* = L^0 \cup L^1 \cup L^2 \cup L^3 \dots$
  - $\{a, bb\}^* = \{\varepsilon, a, bb, aa, abb, bba, bbbb, aaa, \dots\}$
  - $\emptyset^* = \{\varepsilon\}$
  - $\{\varepsilon\}^* = \{\varepsilon\}$
  - For any other language  $L$ ,  $L^*$  is infinite

# Sigma Star

- We denote our alphabet as  $\Sigma$ 
  - `\Sigma` in Latex
- A character is just a really short string, so an alphabet is a language
- $\Sigma^*$  is the set of all strings using the alphabet  $\Sigma$
- $2^{\Sigma^*}$  is the set of all languages using  $\Sigma$

# What Shall we put in the box?

- Goal: start with something easy to prove things about
- We've talked about Java, but that's complex



# Finite State Automaton

- Simple model of computation
- Represents computation without memory
- Kind of decider
- Our machine reads the input string only once, and one character at a time
- After reading each character, enters a new “state”
- State transition rules depend only on the current state and the current character (no looking back!)
- There are only finitely many states



# Gumball Machine

- Our gumball machine takes only coins and does not give change
- Each gumball costs 7 cents
- $\Sigma = \{p, n\}$  (penny, nickel)
- We need to decide the language of sequences of coins adding up to at least 7 cents

# Gumball Machine

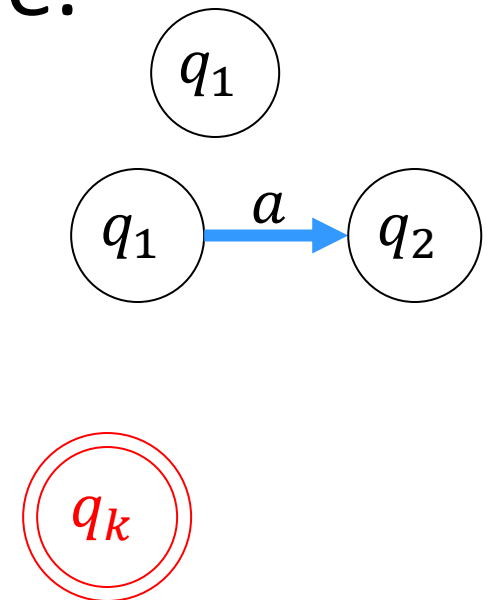
- What are all the possible “states” the machine could be in?
- $0c, 1c, 2c, 3c, 4c, 5c, 6c, 7+c$
- Which “state” should the machine start in?
- Which “state” means we’ve sold a gumball?
- $6c$  plus a penny is always  $7c$ , no matter how I got to  $6c$  (*ppppppp*, or *pn*, or *np*)

# Gumball Machine

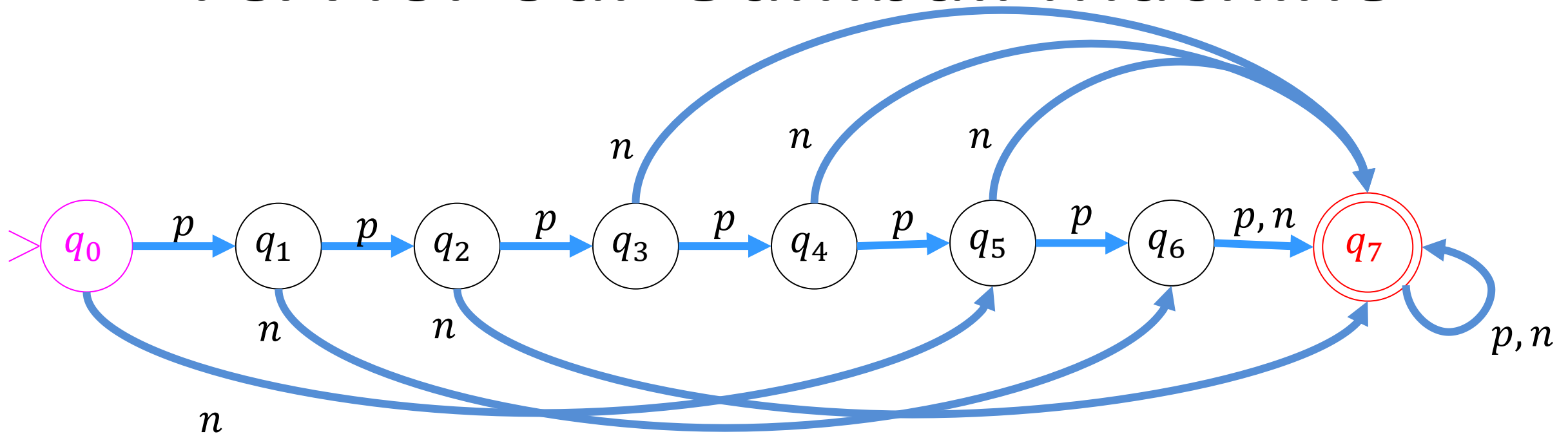
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- $6c$  plus a penny is always  $7c$ , no matter how I got to  $6c$  (*ppppppp*, or *pn*, or *np*)

# Finite State Automata

- Basic idea: a FA is a “machine” that changes states while processing symbols, one at a time.
- Finite set of states:  $Q = \{q_0, q_1, \dots, q_7\}$
- Transition function:  $\delta: Q \times \Sigma \rightarrow Q$
- Initial state:  $q_0 \in Q$
- Final states:  $F \subseteq Q$
- Finite state automaton is  $M = (Q, \Sigma, \delta, q_0, F)$
- Accept if we end in a Final state, otherwise Reject



# FSA for our Gumball Machine



Strings this accepts:

*pppppppp*

*nnnnnnnn*

*pnp*

*ppn*

Strings this rejects:

*ppp*

*n*

*np*

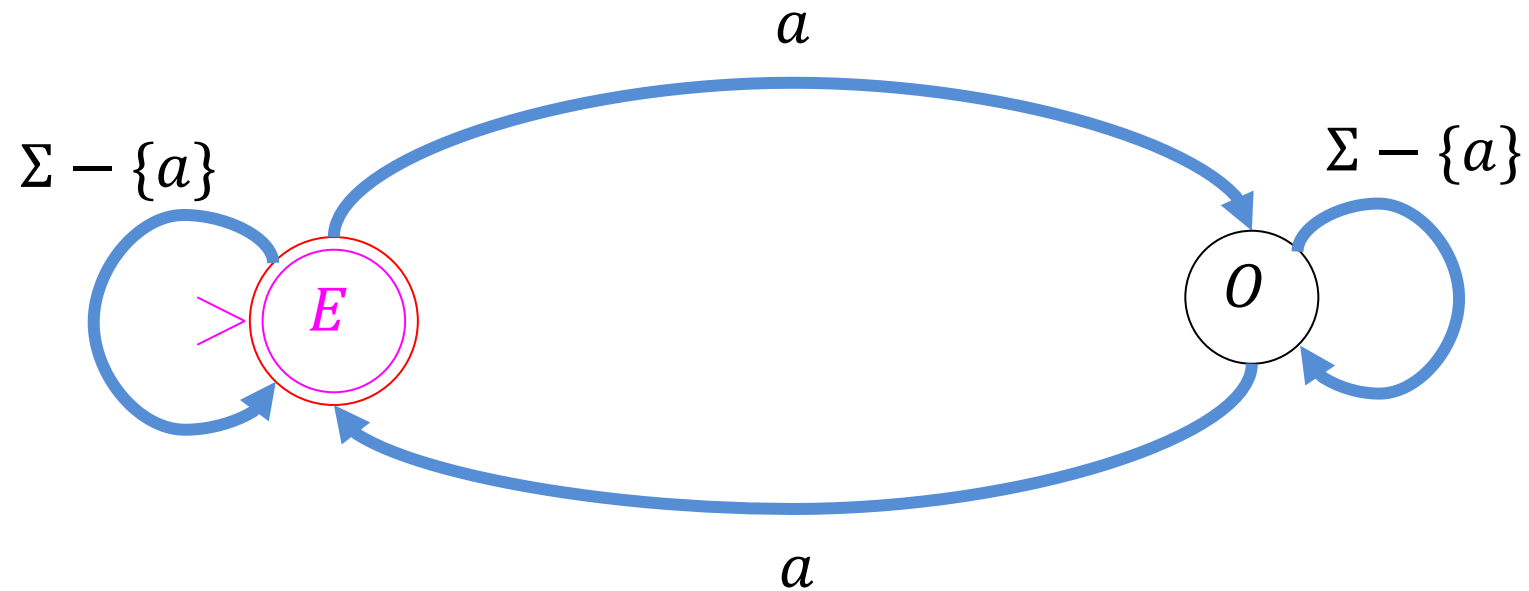
# EvenA

- In HW1 you were asked to give a decider for EvenA (accepts all strings with an even number of A's)
- How did you do it?

# EvenA using FSA

1. What's our alphabet? (pick  $\Sigma$ )
2. What should our states be? (pick  $Q$ )
3. Which states are the accept states? (pick  $F$ )
4. Which state is the start state? (pick  $q_0$ )
5. How should we transition? (pick  $\delta$ )

# Let's Draw It!





# EvenAOddB

- Let's make a finite state automaton which accepts strings that have an even number of  $a$ 's followed by an odd number of  $b$ 's (in that order)
- It should accept:
  - $b, bbb, aab, aaaabbbbbb, \dots$
- It should reject:
  - $bb, ab, baa, aba, aaabb$

# EvenAOddB using FSA

1. What's our alphabet? (pick  $\Sigma$ )
2. What should our states be? (pick  $Q$ )
3. Which states are the accept states? (pick  $F$ )
4. Which state is the start state? (pick  $q_0$ )
5. How should we transition? (pick  $\delta$ )