

# BU CS 332 – Theory of Computation

## Lecture 2:

- Deterministic Finite Automata,  
Regular languages
- Non-deterministic FAs

Reading:  
Sipser Ch 1.1-1.2

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# Review: What is a Computational Problem?

A computational problem is represented by way of a function

$$f: D \rightarrow R$$

( $D$  is the domain,  $R$  is the range).

*Handwritten:*  $f: S \rightarrow \{0,1\}^*$

A naïve representation of  $f$  : via a table

*Handwritten:*  $f(x) = \begin{cases} 1 & \text{if } x \in L \\ 0 & \text{otherwise} \end{cases}$

Elements of $D$	Corresponding value of $f$
$x$	$f(x)$
$\vdots$	

Note:  $D \rightarrow R$  can be infinite! (That's the interesting case...)

# What is a Computational Problem?

We will concentrate on functions from strings to {0,1}.

(Or: recognizing whether a *string* is in a *language*.)

- Alphabet: A finite set  $\Sigma$

Ex.  $\Sigma = \{a, b, \dots, z\}$

- **String**: A finite concatenation of alphabet symbols (order matters)

Ex. bqr, ababb

The length of a string is the number of symbols.

$\varepsilon$  denotes empty string, length 0

$\Sigma^*$  = set of all finite strings over  $\Sigma$

- Language: A (possibly infinite) set  $L$  of strings :  $L \subseteq \Sigma^*$

# Examples of Languages (Computational problems)

**Parity:** Given a string consisting of  $a$ 's and  $b$ 's, does it contain an even number of  $a$ 's?

$$\Sigma = \{a, b\} \quad L = \{x \mid x \text{ has an even \# of } a\}$$

**Primality:** Given a natural number  $x$  (represented in binary), is  $x$  prime?

$$\Sigma = \{0, 1\} \quad L = \{x \mid x \text{ represents a number which is prime}\}$$

**Halting Problem:** Given a C program, can it ever get stuck in an infinite loop?

$$\Sigma = \{\text{ascii char}\} \quad L = \{x \mid \langle x \rangle (c) \text{ gets stuck in i.l.}\}$$

*+ here evl of input s.t.*

# Models of computation: Machines

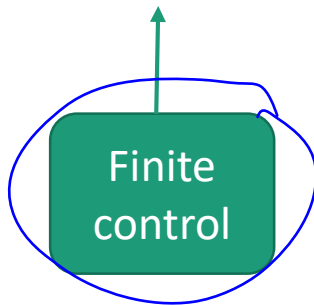
Computation is the processing of information by the **repeated application** of a **small set** of **Simple** operations.

→ What is the simplest “machine model” that can capture computation?

Input 

<u>a</u>	<u>b</u>	a	a	-	
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 ...

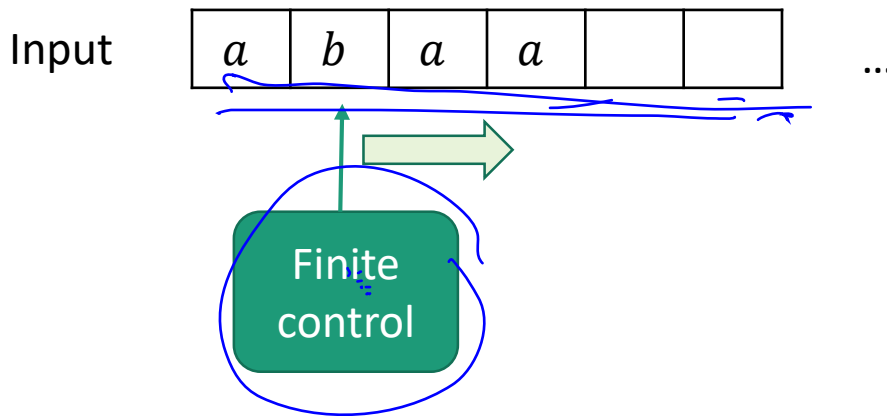


(Finite = “fixed size, independent of input length”)

Abstraction: We don’t care how the control is implemented. We simply consider “states” of the control. We want the possible number of states to be small/bounded, and to transition between states using fixed rules.

# Machine Models

- Finite Automata (FAs): Machine with a finite amount of unstructured memory

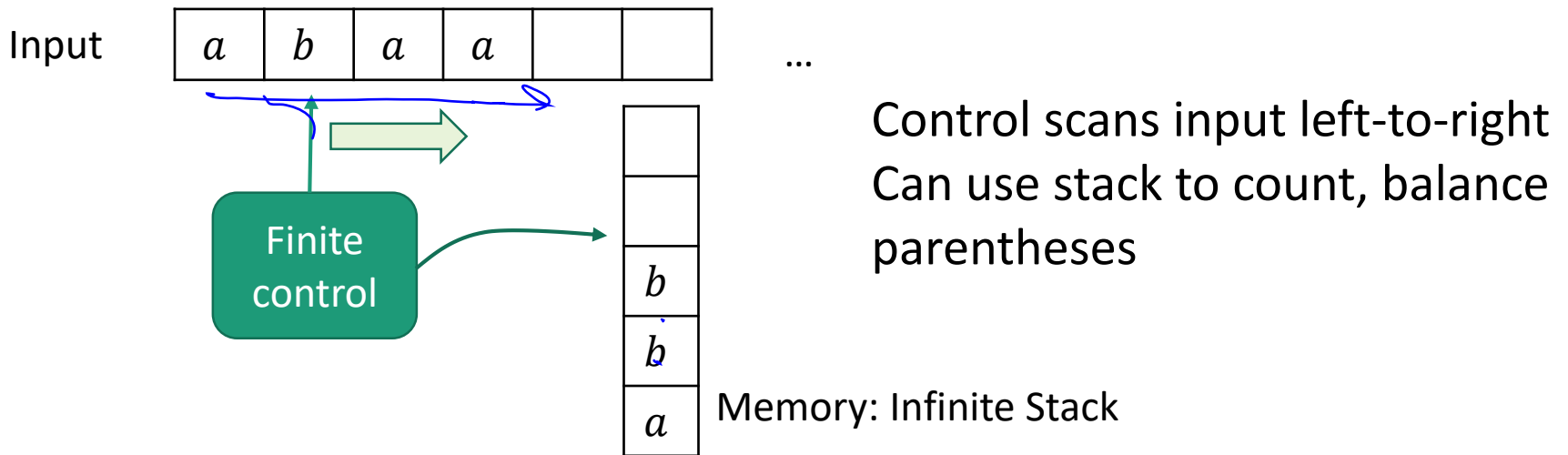


Control scans input left-to-right  
Can check simple patterns  
Can't perform unlimited counting

Useful for modeling chips, simple control systems, choose-your-own adventure games, streaming algorithms...

# Machine Models

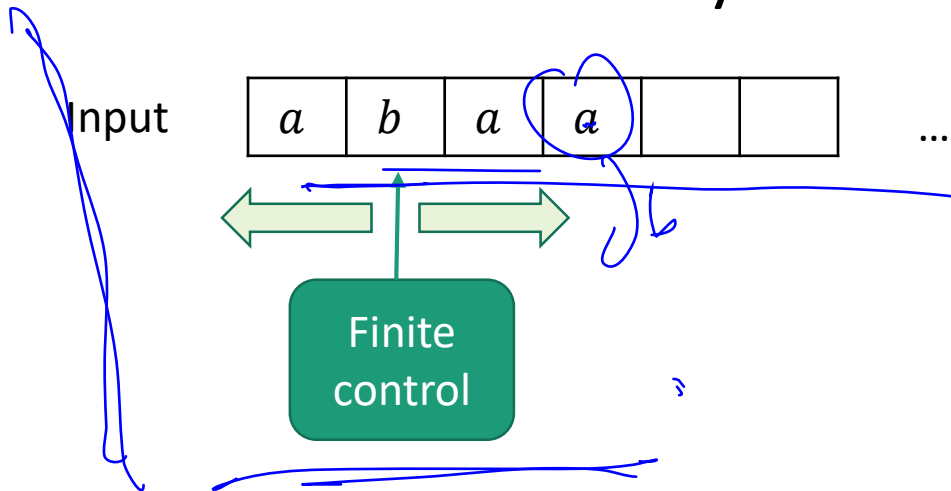
- Pushdown Automata (PDAs): Machine with unbounded structured memory in the form of a stack



Useful for modeling parsers, compilers, some math calculations

# Machine Models

- Turing Machines (TMs): Machine with unbounded, unstructured memory



Control can scan in both directions  
Control can both read and write

Model for general sequential computation

**Church-Turing Thesis:** Everything we intuitively think of as “computable” is computable by a Turing Machine



# What would we like to know?

We will classify languages (computational problems) based on which types of machines can recognize them

Then we will show things like:

**Inclusion:** Every language recognizable by a FA is also recognizable by a TM

**Non-inclusion:** There exist languages recognizable by TMs which are not recognizable by FAs

**Hardness:** Identify a “hard” and “easy” languages

**Robustness:** Alternative definitions of the same class

Ex. Languages recognizable by FAs = regular expressions

# Why study theory of computation?

- You will learn how to formally reason about computation
- You will learn the technology-independent foundations of CS

## Philosophically interesting questions:

- Are there well-defined problems which cannot be solved by computers?
- Can we always find the solution to a puzzle faster than trying all possibilities?
- Can we say what it means for one problem to be “harder” than another?
  
- This is the core of CS!

# Why study theory of computation?

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# Why study theory of computation?

## Practical knowledge for developers



“Boss, I can’t find an efficient algorithm.  
I guess I’m just too dumb.”

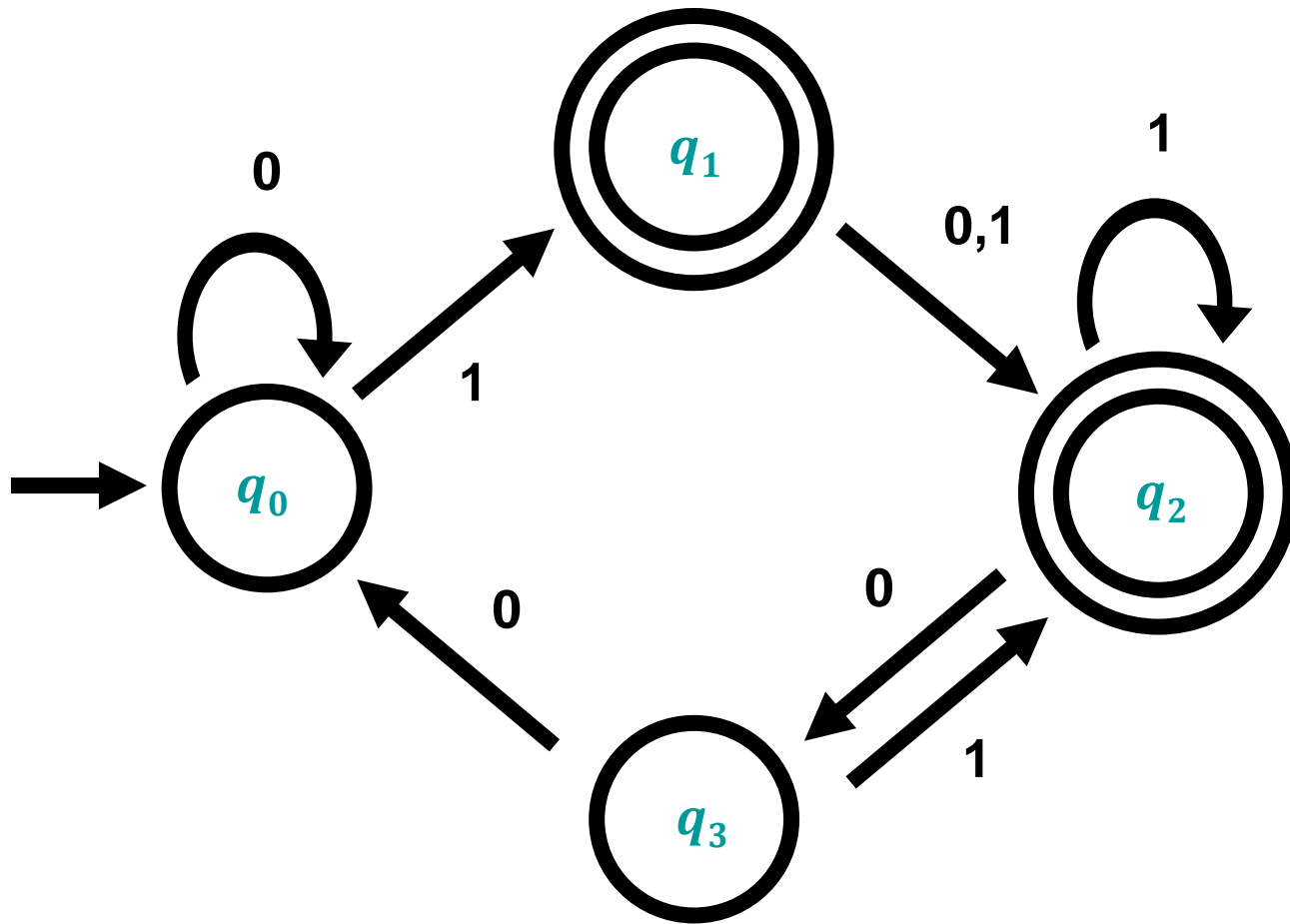


“Boss, I can’t find an efficient algorithm  
because no such algorithm exists.”

## Will you be asked about this material on job interviews?

No promises, but a true story...

# Anatomy of a DFA



# Formal Definition of a DFA

A **finite automaton** is a 5-tuple  $M = (Q, \Sigma, \delta, q_0, F)$

$Q$  is the set of states

$\Sigma$  is the alphabet

$\delta: Q \times \Sigma \rightarrow Q$  is the transition function

$q_0 \in Q$  is the start state

$F \subseteq Q$  is the set of accept states

$$Q = \{q_0, q_1\}$$
$$\Sigma = \{a, b\}$$
$$F = \{q_0\}$$

	a	b
$q_0$	$q_1$	$q_0$
$q_1$	$q_0$	$q_1$

# Formal Definition of DFA Computation

A DFA  $M = (Q, \Sigma, \delta, q_0, F)$  **accepts** a string  $w = w_1 w_2 \cdots w_n \in \Sigma^*$  (where each  $w_i \in \Sigma$ ) if there exist  $r_0, \dots, r_n \in Q$  such that

1.  $r_0 = q_0$
2.  $\delta(r_i, w_{i+1}) = r_{i+1}$  for each  $i = 0, \dots, n - 1$ , and
3.  $r_n \in \underline{F}$

$L(M)$  = the **language** of machine  $M$

= set of all (finite) strings machine  $M$  accepts

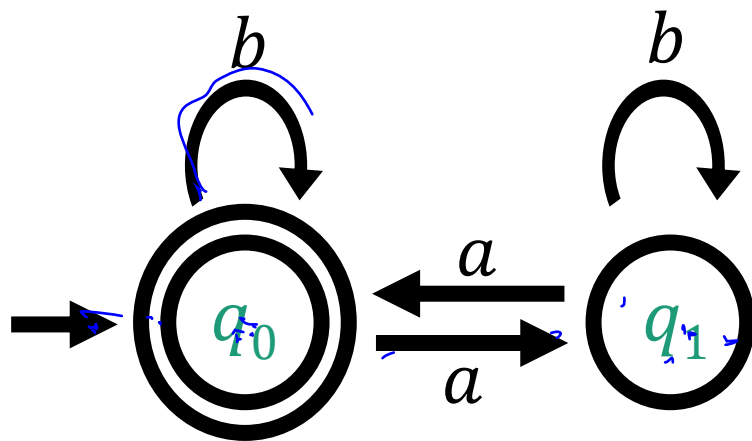
$M$  **recognizes** the language  $L(M)$

$L(M) = \text{DFA } M$

# A DFA for Parity

**Parity:** Given a string consisting of  $a$ 's and  $b$ 's, does it contain an even number of  $a$ 's?

$\Sigma = \{a, b\}$       $L = \{w \mid w \text{ contains an even number of } a\text{'s}\}$



State set  $Q =$

Alphabet  $\Sigma =$

Transition function  $\delta$

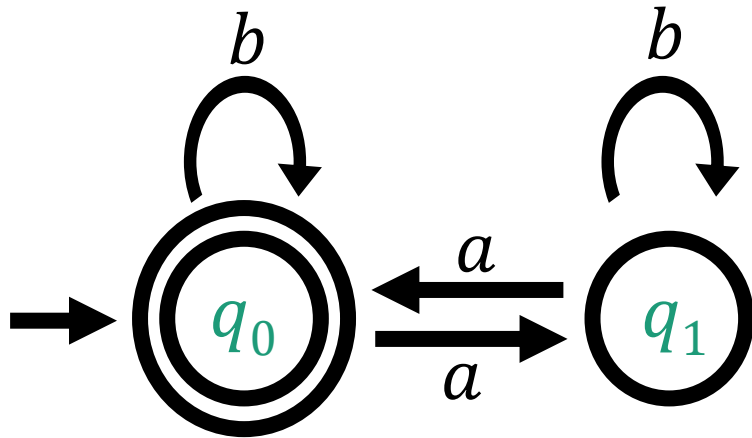
$\delta$	$a$	$b$
$q_0$		
$q_1$		

Start state  $q_0$

Set of accept states  $F =$



# Example: Computing with the Parity DFA



Let  $w = abba$   
Does  $M$  accept  $w$ ?

A DFA  $M = (Q, \Sigma, \delta, q_0, F)$  **accepts** a string  $w = w_1w_2 \cdots w_n \in \Sigma^*$  (where each  $w_i \in \Sigma$ ) if there exist  $r_0, \dots, r_n \in Q$  such that

1.  $r_0 = q_0$
2.  $\delta(r_i, w_{i+1}) = r_{i+1}$  for each  $i = 0, \dots, n - 1$ , and
3.  $r_n \in F$

# Automata Tutor

<http://automatatutor.com/>

# Regular Languages

$L$  is regular iff  $\exists$  DFA  $M$   
s.t.  $L = L(M)$

**Definition:** A language is **regular** if it is recognized by a DFA

- $L = \{ w \in \{a, b\}^* \mid w \text{ has an even number of } a\text{'s} \}$  is regular
- $L = \{ w \in \{0, 1\}^* \mid w \text{ contains } 001 \}$  is regular

Many interesting programs recognize regular languages

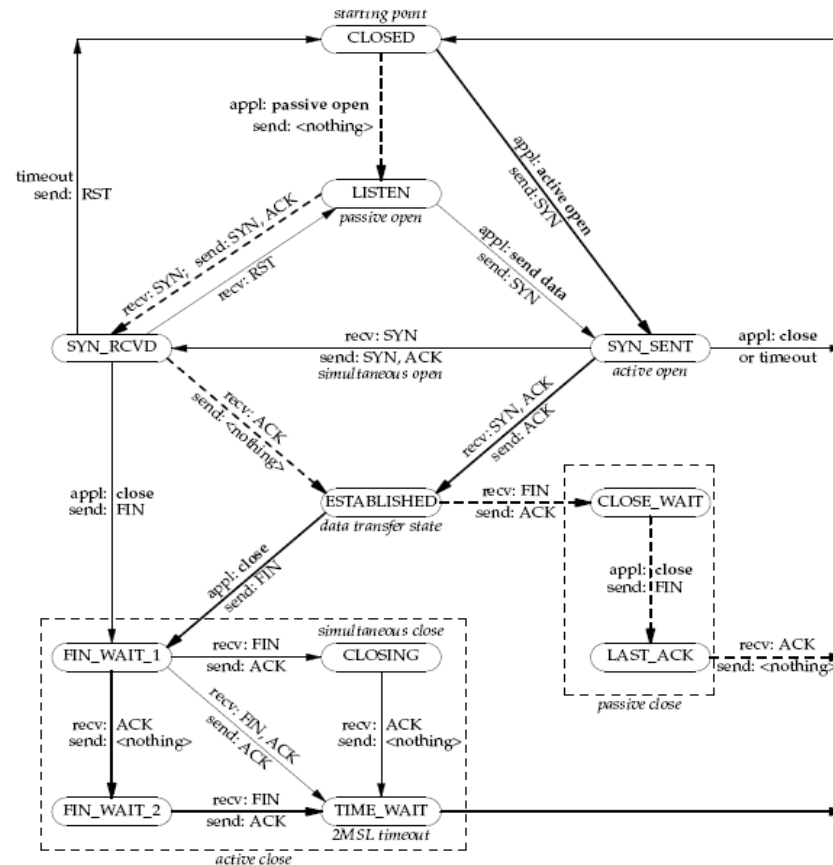
NETWORK PROTOCOLS

COMPILERS

GENETIC TESTING

ARITHMETIC

# Internet Transmission Control Protocol



Let  $TCPS = \{ w \mid w \text{ is a complete TCP Session} \}$

**Theorem.** TCPS is regular

# Compilers

## Comments :

Are delimited by `/* */`

Cannot have nested `/* */`

Must be closed by `*/`

`*/` is illegal outside a comment

**COMMENTS** = {strings over {0,1, /, \*} with legal comments}

**Theorem.** **COMMENTS** is regular.

# Genetic Testing

**DNA sequences** are strings over the alphabet  $\{A, C, G, T\}$ .

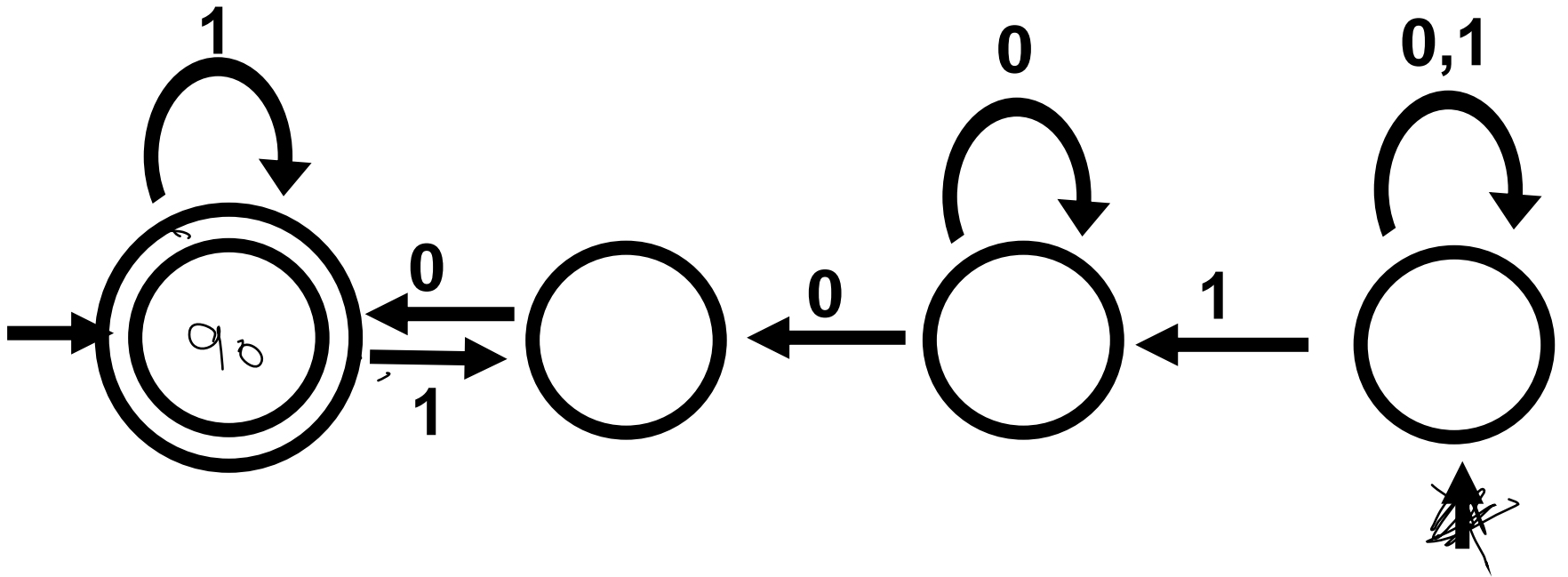
A **gene  $g$**  is a special substring over this alphabet.

A **genetic test** searches a DNA sequence for a gene.

**GENETICTEST $_g$**  = {strings over  $\{A, C, G, T\}$  containing  $g$  as a substring}

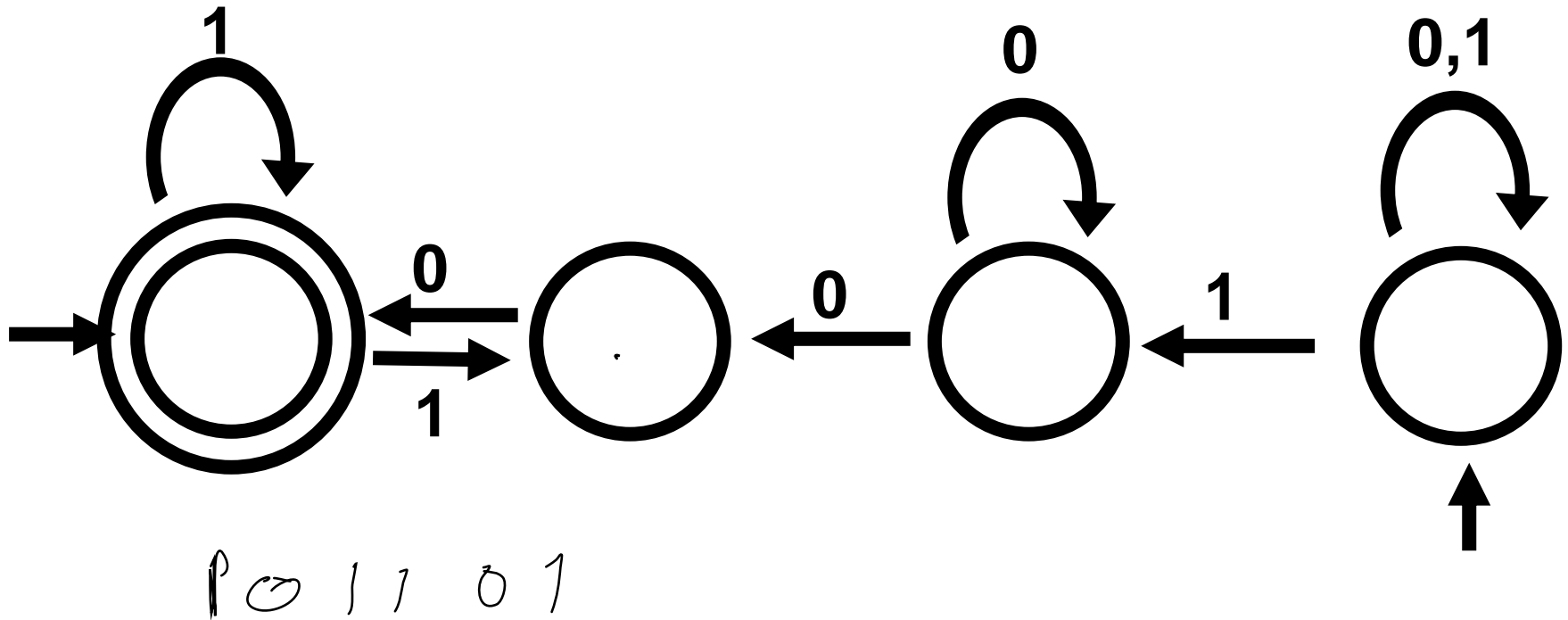
**Theorem.** GENETICTEST $_g$  is regular for every gene  $g$ .

# Non-deterministic Finite Automata



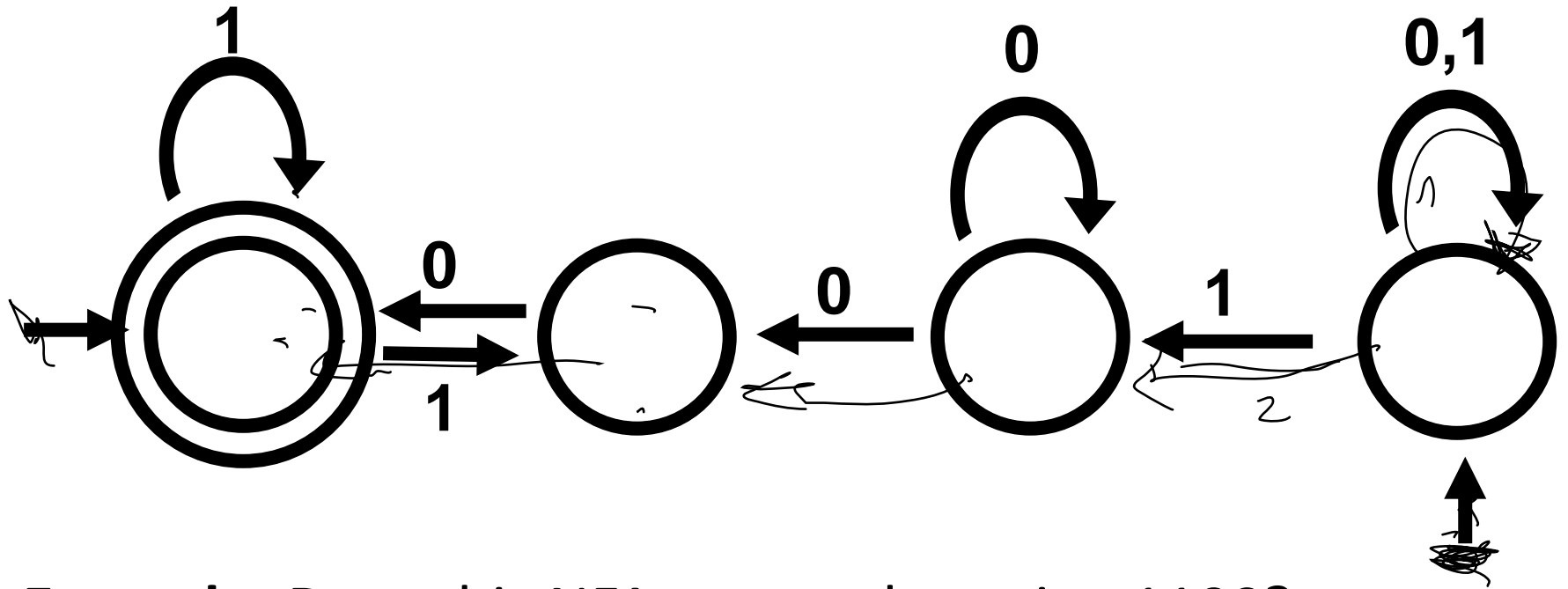


# Nondeterminism



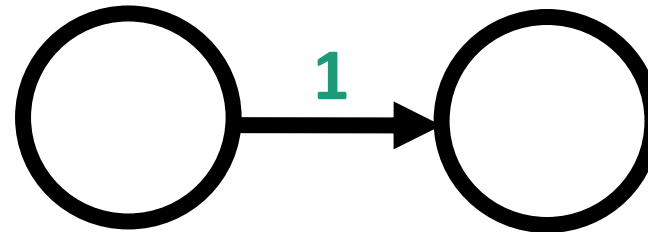
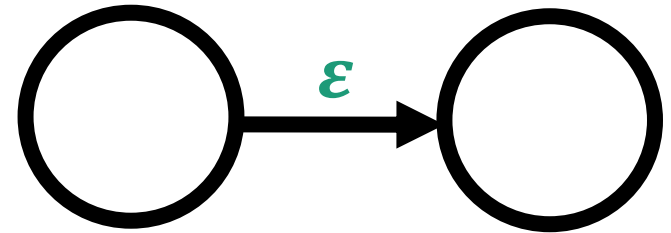
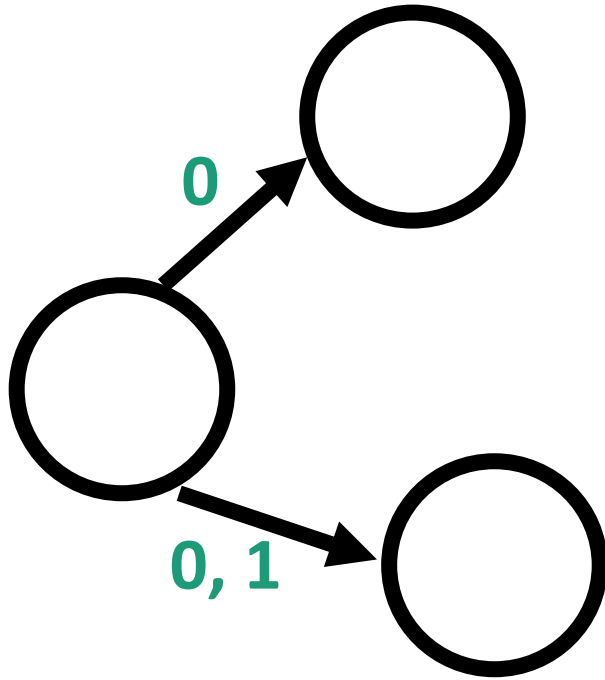
A **Nondeterministic Finite Automaton (NFA)** accepts if there is a way to make it reach an accept state.

# Nondeterminism

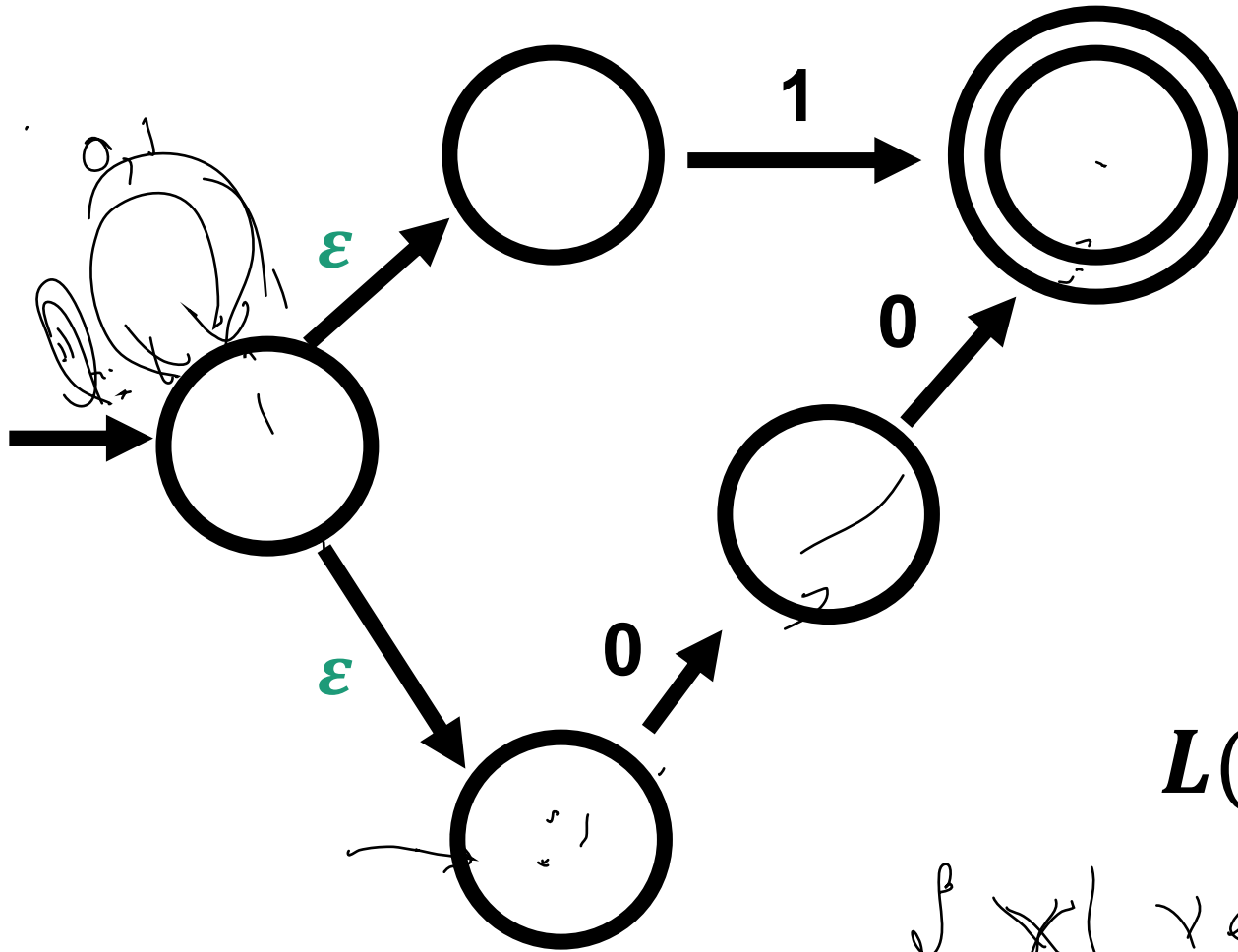


**Example:** Does this NFA accept the string 1100?

# Some special transitions



# Example

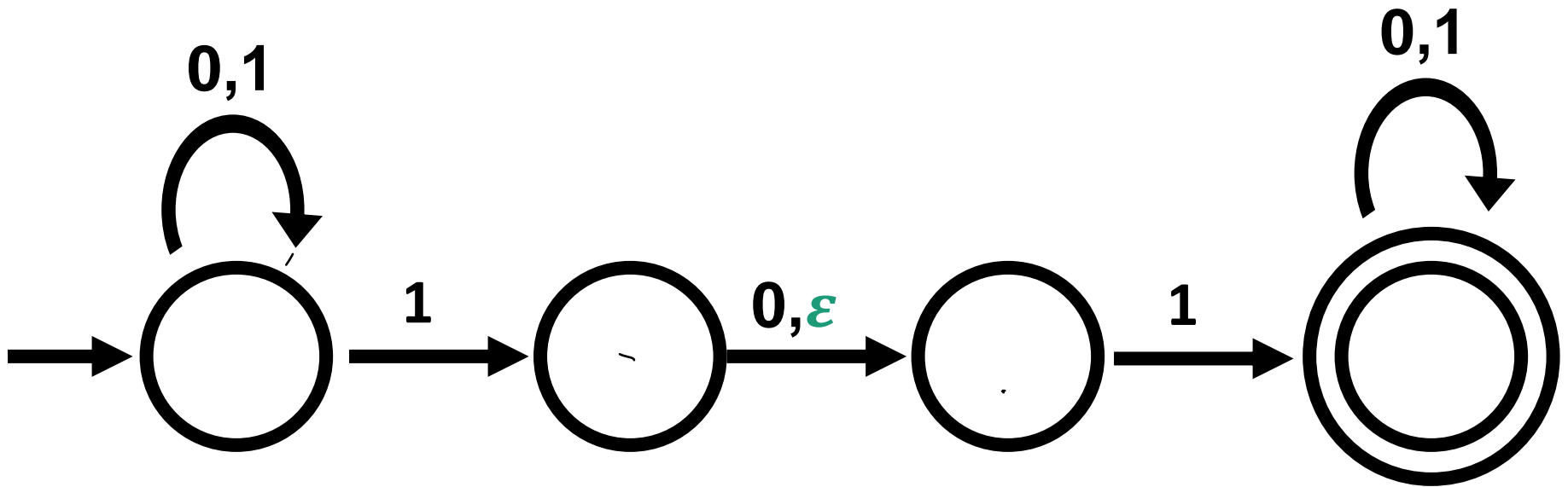


! 0 1 1 0 0

$$L(M) = \{1, 00\}$$

$\{ \text{all strings with } 00 \text{ or } 1 \}$

# Example



$$L(M) = \{ x \mid x \text{ has either } 11 \text{ or } 101 \text{ as a substring} \}$$



# Formal Definition of a NFA

An **NFA** is a 5-tuple  $M = (Q, \Sigma, \delta, q_0, F)$

$Q$  is the set of states

$\Sigma$  is the alphabet

$\Sigma \cup \{\epsilon\}$

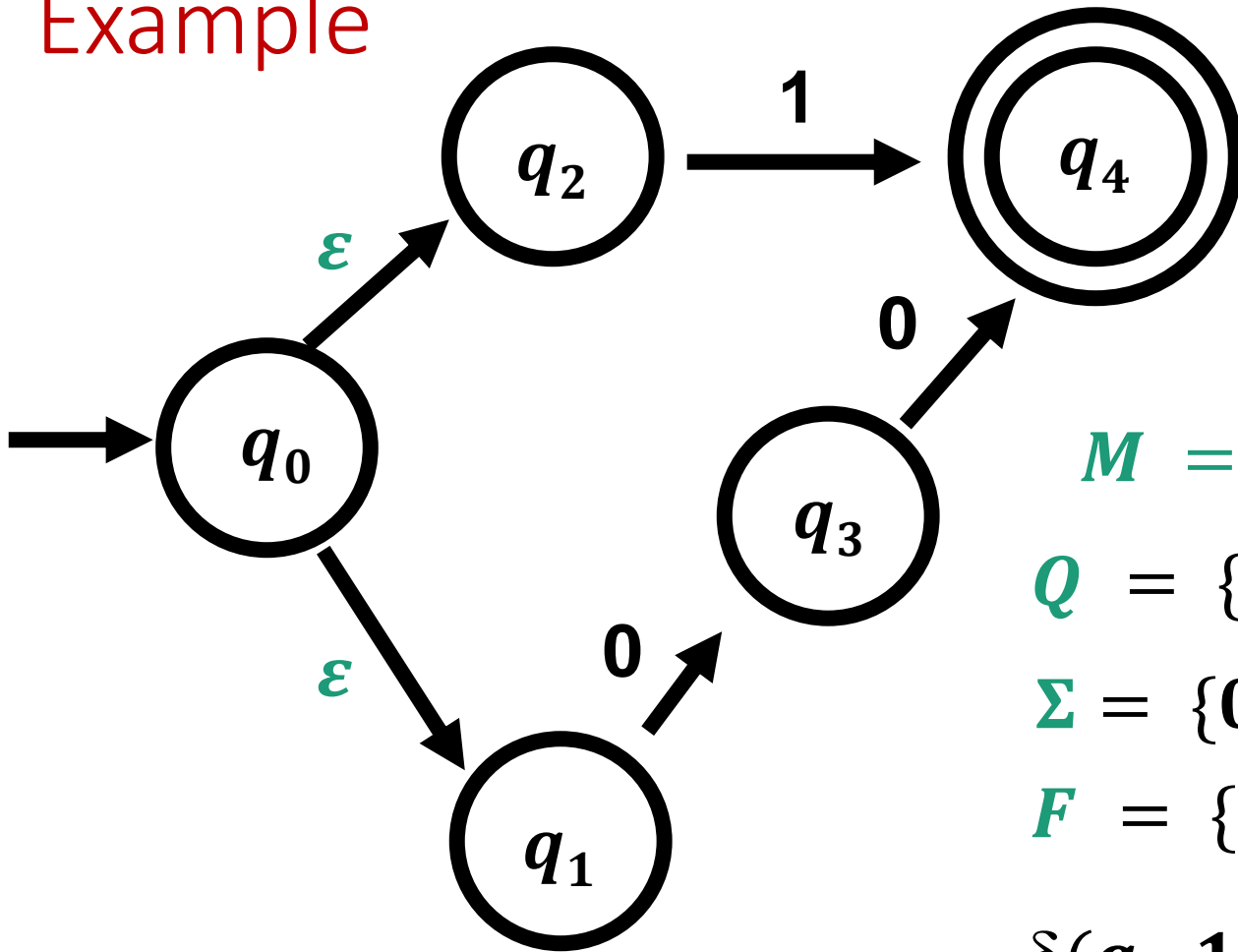
$\delta : \underline{Q} \times \underline{\Sigma_\epsilon} \rightarrow \underline{P(Q)}$  is the transition function

$q_0 \in Q$  is the start state

$F \subseteq Q$  is the set of accept states

$M$  **accepts** a string  $w$  if **there exists** a path from  $q_0$  to an accept state that can be followed by reading  $w$ .

# Example



$$M = (Q, \Sigma, \delta, Q_0, F)$$

$$Q = \{q_0, q_1, q_2, q_3, q_4\}$$

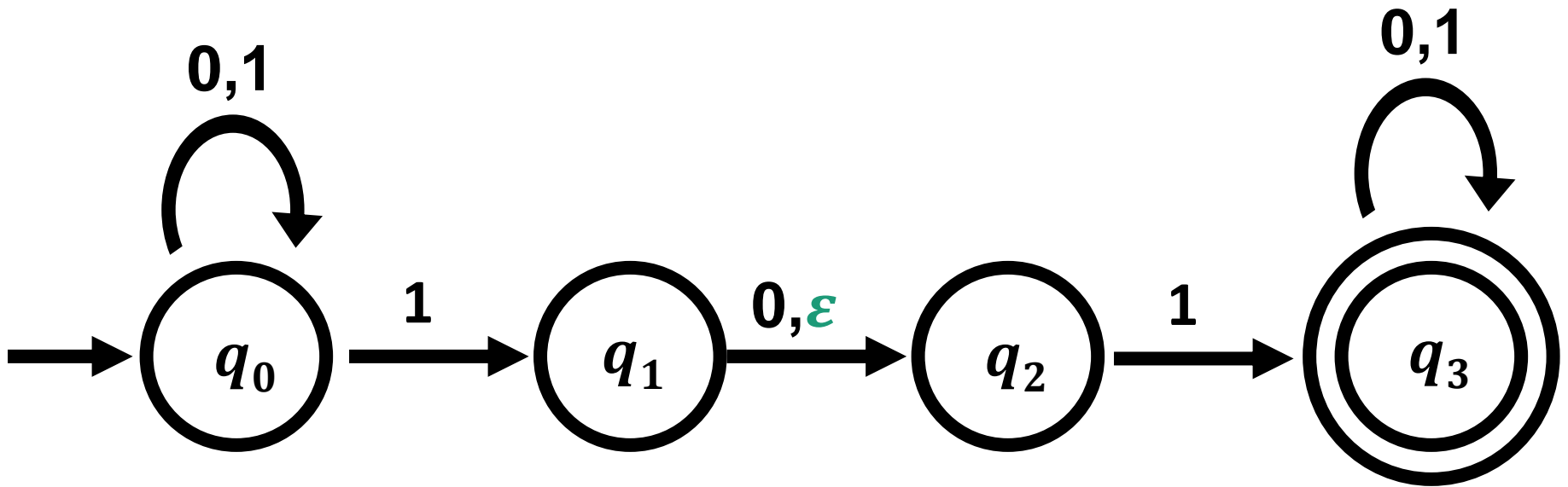
$$\Sigma = \{0, 1\}$$

$$F = \{q_4\}$$

$$\delta(q_2, 1) =$$

$$\delta(q_3, 1) =$$

# Example



$$N = (Q, \Sigma, \delta, q_0, F)$$

$$Q = \{q_0, q_1, q_2, q_3\}$$

$$\Sigma = \{0, 1\}$$

$$F = \{q_3\}$$

$$\delta(q_0, 0) =$$

$$\delta(q_0, 1) =$$

$$\delta(q_1, \epsilon) =$$

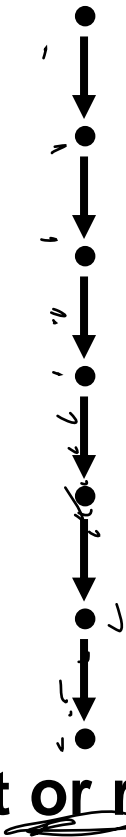
$$\delta(q_2, 0) =$$



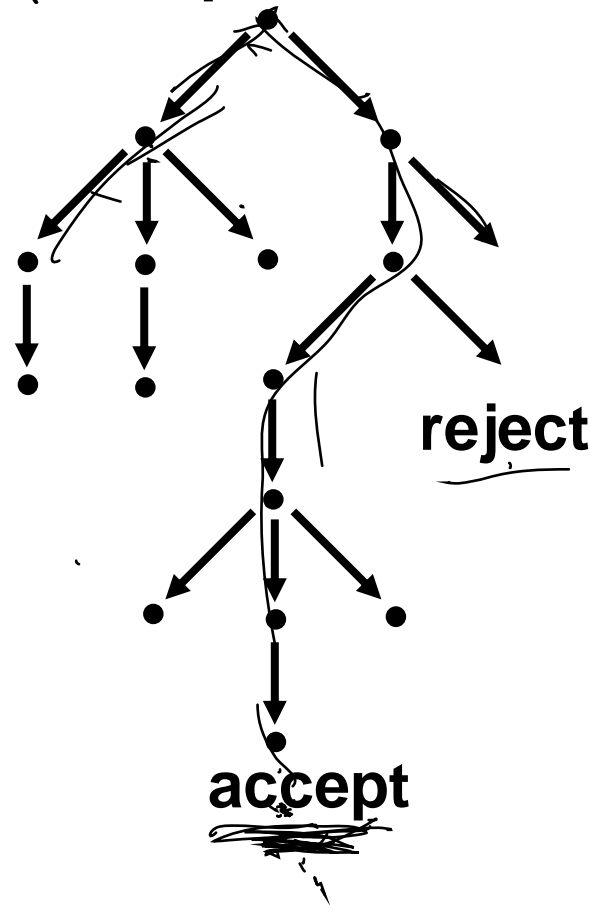


# Nondeterminism

## Deterministic Computation



## Nondeterministic Computation



### *Ways to think about nondeterminism*

- (restricted) parallel computation
- tree of possible computations
- guessing and verifying the "right" choice

# Why study NFAs?

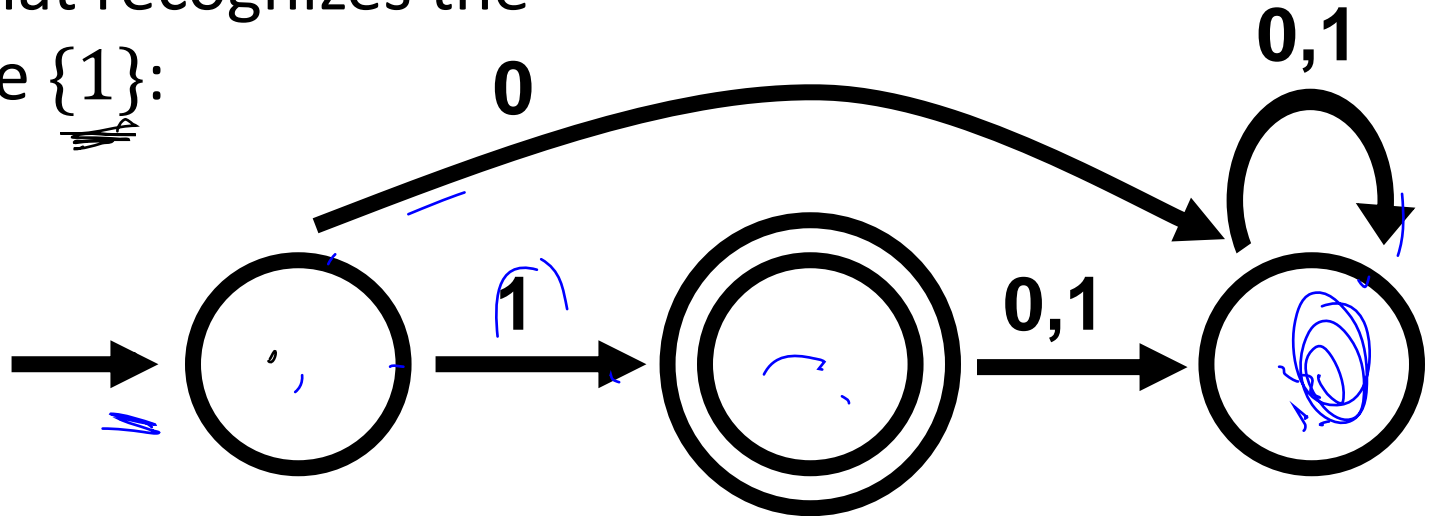
- Not really a realistic model of computation: Real computing devices can't really try many possibilities in parallel

But:

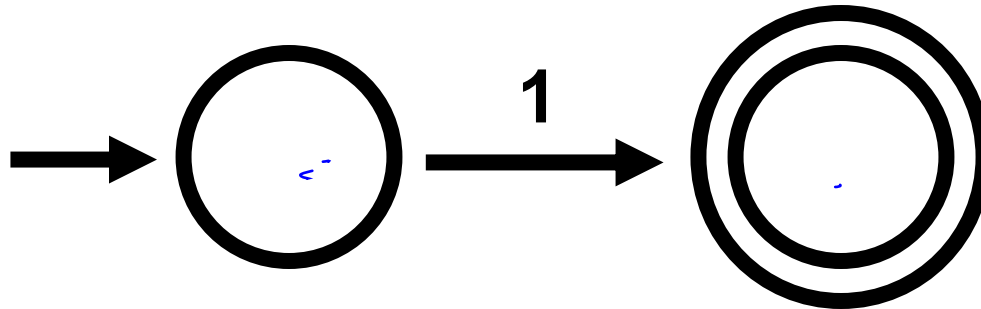
- Useful tool for understanding power of DFAs/regular languages
- NFAs can be simpler than DFAs
- Lets us study “nondeterminism” as a resource  
(cf. P vs. NP)

# NFAs can be simpler than DFAs

A DFA that recognizes the language  $\{1\}$ :



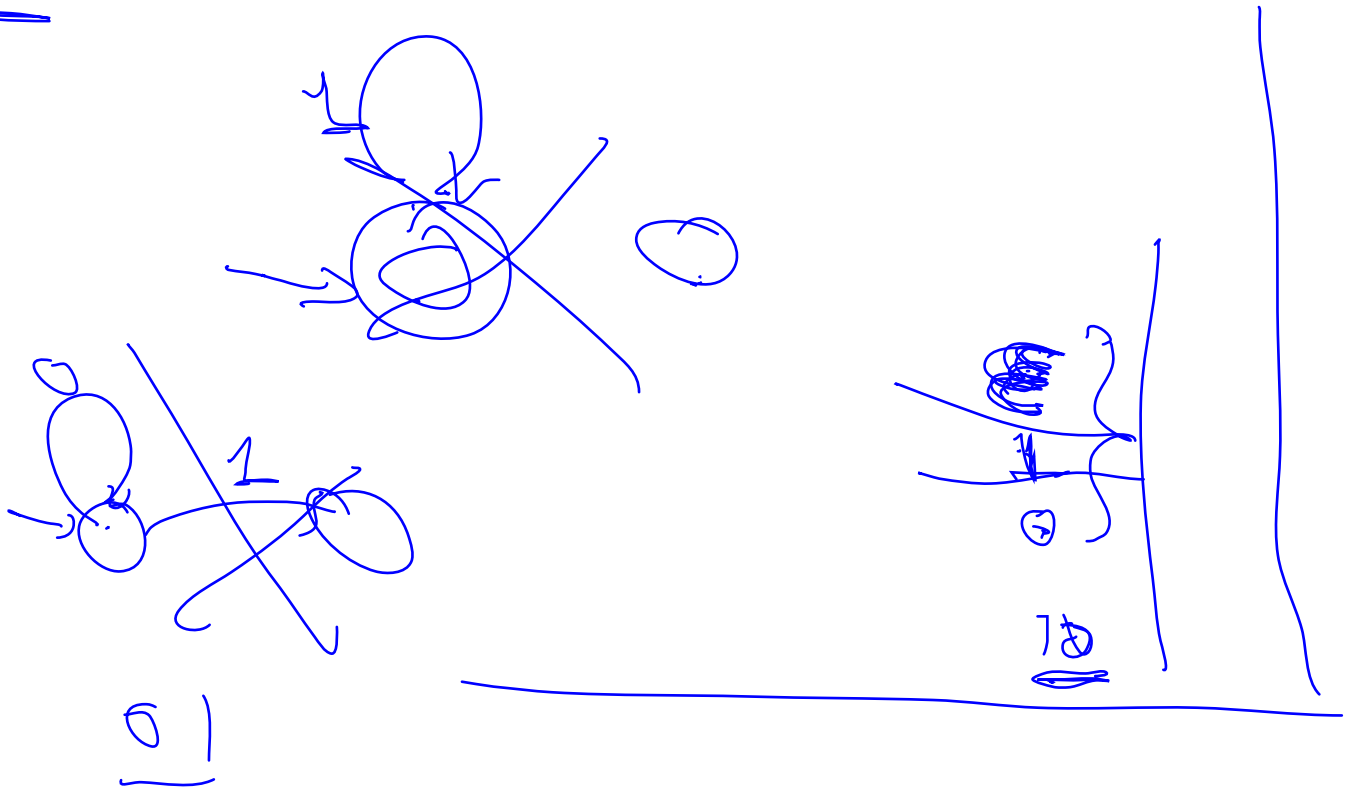
An NFA that recognizes the language  $\{1\}$ :



# Sometimes DFAs **must** be larger

**Theorem.** Every DFA for the language  $\{1\}$  must have at least 3 states.

**Proof:**



# Equivalence of NFAs and DFAs

# Equivalence of NFAs and DFAs

Every DFA *is* an NFA, so NFAs are *at least* as powerful as DFAs

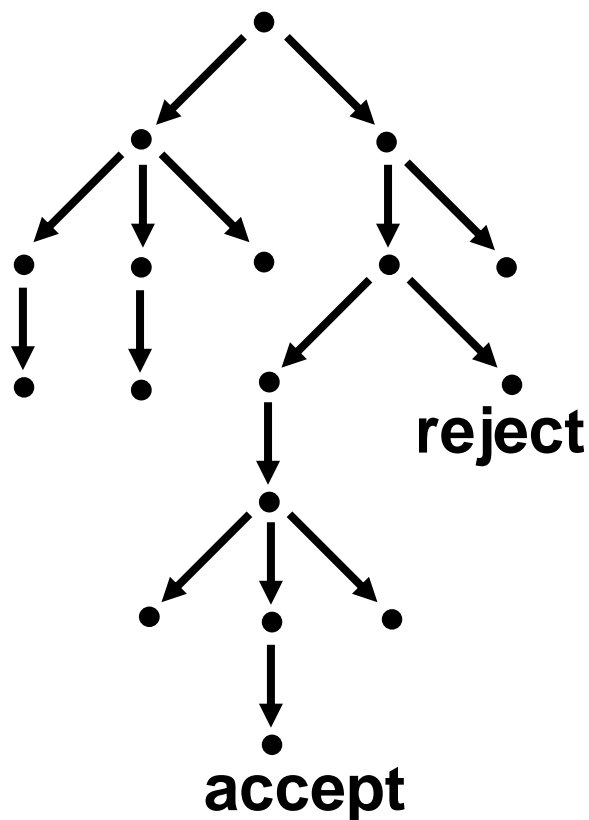
**Theorem:** For every NFA  $N$ , there is a DFA  $M$  such that  $L(M) = L(N)$

**Corollary:** A language is regular if and only if it is recognized by an NFA

# Equivalence of NFAs and DFAs (Proof)

Let  $N = (Q, \Sigma, \delta, q_0, F)$  be an NFA

Goal: Construct DFA  $M = (Q', \Sigma, \delta', q_0', F')$  recognizing  $L(N)$

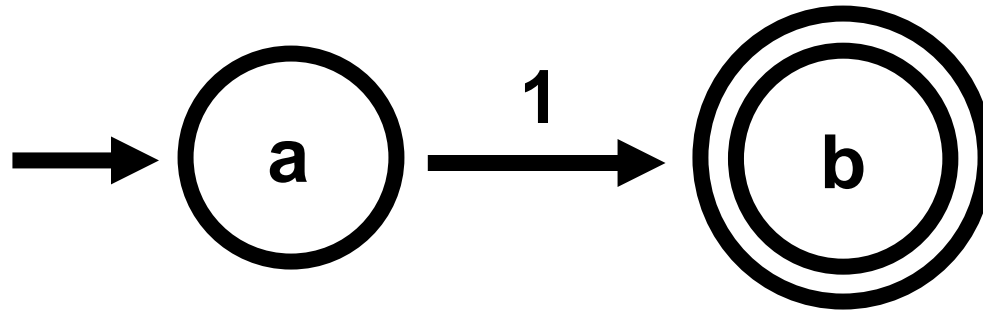


**Intuition:** Run all threads of  $N$  in parallel, maintaining the set of states where all threads are.

**Formally:**  $Q' = P(Q)$

“The Subset Construction”

# NFA -> DFA Example





# Subset Construction (Formally)

**Input:** NFA  $N = (Q, \Sigma, \delta, q_0, F)$

**Output:** DFA  $M = (Q', \Sigma, \delta', q_0', F')$

$Q'$

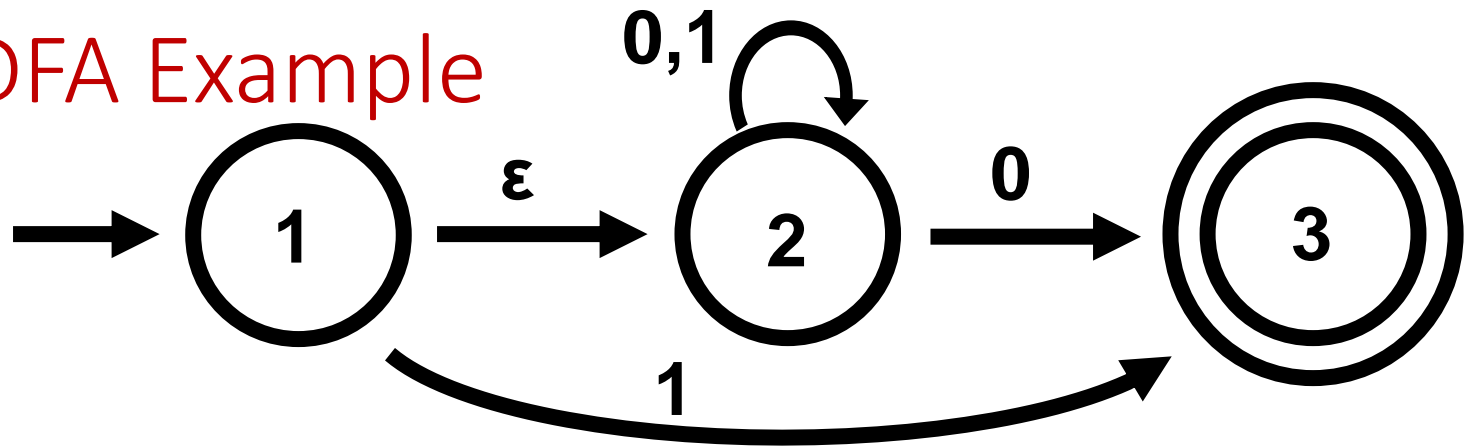
$\delta' : Q' \times \Sigma \rightarrow Q'$

$\delta'(R, \sigma) =$  for all  $R \subseteq Q$  and  $\sigma \in \Sigma$ .

$q_0' =$

$F' =$

# NFA -> DFA Example



# Subset Construction (Formally)

**Input:** NFA  $N = (Q, \Sigma, \delta, q_0, F)$

**Output:** DFA  $M = (Q', \Sigma, \delta', q_0', F')$

$$Q' = P(Q)$$

$$\delta' : Q' \times \Sigma \rightarrow Q'$$

$$\delta'(R, \sigma) = \bigcup_{r \in R} \delta(r, \sigma) \quad \text{for all } R \subseteq Q \text{ and } \sigma \in \Sigma.$$

$$q_0' = \{q_0\}$$

$$F' = \{R \in Q' \mid R \text{ contains some accept state of } N\}$$

# Proving the Construction Works

**Claim:** For every string  $w$ , running  $M$  on  $w$  leads to state

$\{q \in Q \mid \text{There exists a computation of } N \text{ on input } w \text{ ending at } q\}$

**Proof idea:** By induction on  $|w|$

# Historical Note

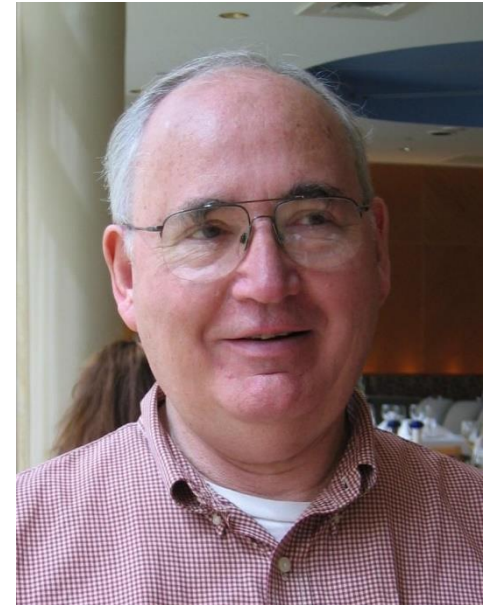


Subset Construction introduced in Rabin & Scott's 1959 paper "Finite Automata and their Decision Problems"



1976 ACM Turing Award citation

For their joint paper "Finite Automata and Their Decision Problem," which introduced the idea of nondeterministic machines, which has proved to be an enormously valuable concept. Their (Scott & Rabin) classic paper has been a continuous source of inspiration for subsequent work in this field.



# Is this construction the best we can do?

Subset construction converts an  $n$  state NFA into a  $2^n$ -state DFA

Could there be a construction that always produces, say, an  $n^2$ -state DFA?

**Theorem:** For every  $n \geq 1$ , there is a language  $L_n$  such that

1. There is an  $(n + 1)$ -state NFA recognizing  $L_n$ .
2. There is no DFA recognizing  $L_n$  with fewer than  $2^n$  states.

**Conclusion:** For finite automata, nondeterminism provides an exponential savings over determinism (in the worst case).