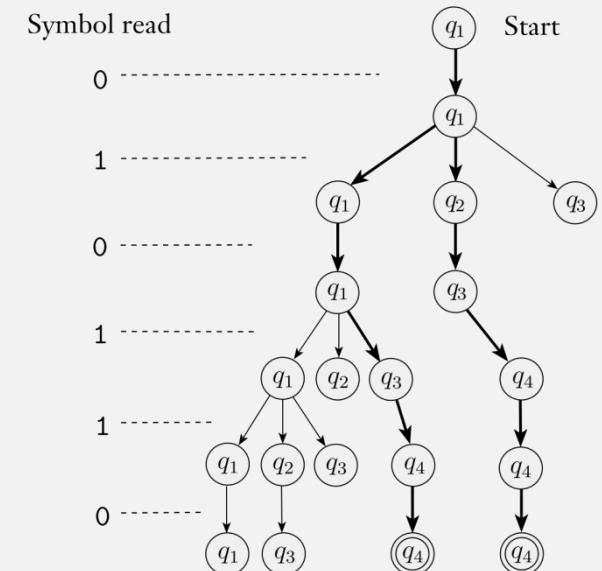


**CS420**  
**Computing with NFAs**

Wednesday, February 21, 2024

UMass Boston CS



## *Announcements*

- HW 2 in
  - Due ~~Wed 2/21 12pm EST (noon)~~
- HW 3 out
  - Due Mon 3/4 12pm EST (noon)

# HW 1 Observations

- Problems must be assigned to the correct pages
- Proof format must be a **Statements and Justifications** table
- Machine formal descriptions must have a tuple

# How to ask for HW help

(there's no such thing as a stupid question, but ...)

... there **is** such thing as a **less useful** question (gets less useful answers)

- “Is this correct?”
- “I don’t get it”
- “Give me a hint?”
- “Do I need to do the thing DFA thing?”

Useful question examples  
(gets useful answers):

- “I think string xyz and zyx is in language A but I’m not sure? Can you clarify?”
- “I’m don’t understand this notation  $A \otimes B \ggg C$  ... and I couldn’t find it in the book”
- “I couldn’t this word’s definition ...”
- “I know I want to change the machine to add an accept state that ... but I can’t figure out how to write it formally. Hint?”

*Previously*

**Concatenation:**  $A \circ B = \{xy \mid x \in A \text{ and } y \in B\}$

# Concatenation of Languages

Let the alphabet  $\Sigma$  be the standard 26 letters  $\{a, b, \dots, z\}$ .

If  $A = \{\text{fort, south}\}$   $B = \{\text{point, boston}\}$

$$A \circ B = \{\text{fortpoint, fortboston, southpoint, southboston}\}$$

# Is Concatenation Closed?

## THEOREM

---

The class of regular languages is closed under the concatenation operation.

In other words, if  $A_1$  and  $A_2$  are regular languages then so is  $A_1 \circ A_2$ .

- Cannot? combine  $A_1$  and  $A_2$ 's machine to make a DFA because:
  - Unclear when to switch? (can only read input once)
- Need a different kind of machine!

# Nondeterministic Finite Automata (NFA)

## DEFINITION

---

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

1.  $Q$  is a finite set of states,

2.  $\Sigma$  is a finite alphabet,

3.  $\delta: Q \times \Sigma_{\varepsilon} \rightarrow \mathcal{P}(Q)$  is the

Transition function maps  
one state and label to a  
set of states

4.  $q_0 \in Q$  is the start state, and

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

Transition label can be “empty”,

$$\Sigma_{\varepsilon} = \Sigma \cup \{\varepsilon\}$$

CAREFUL:

$\varepsilon$  symbol is reused here, as a transition label (ie, an argument to  $\delta$ )

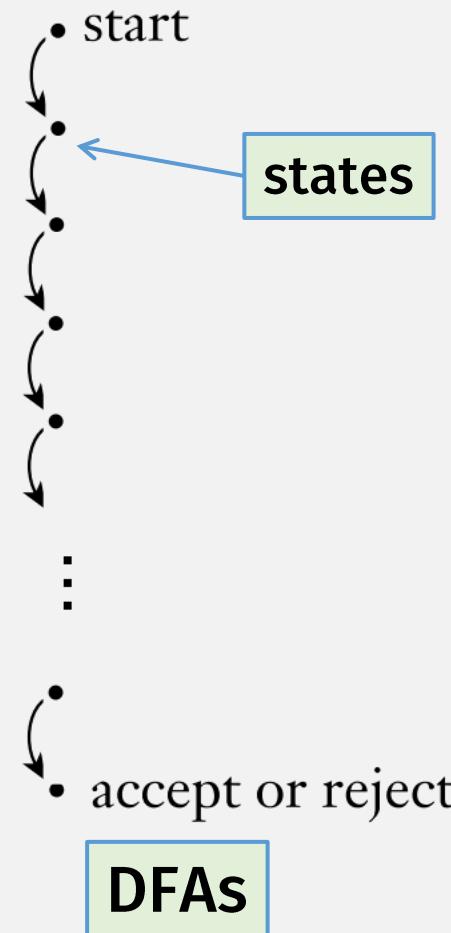
- it's not the empty string!

- And, it's (still) not a character in alphabet  $\Sigma$ !

*Previously*

# Deterministic vs Nondeterministic

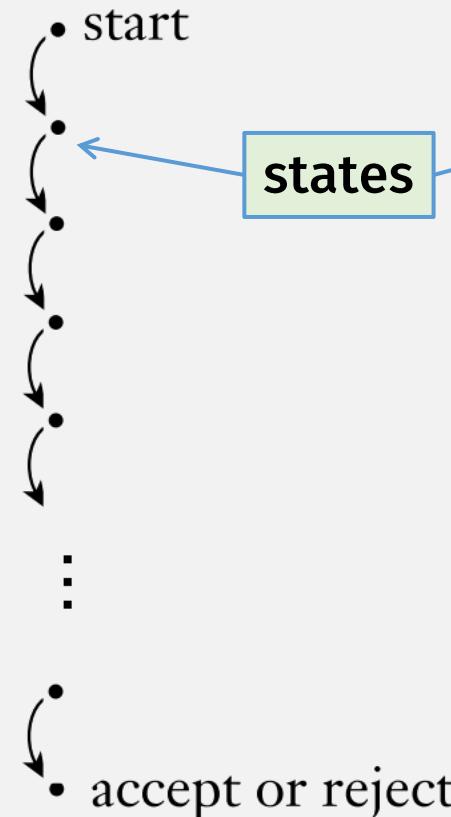
Deterministic  
computation



Previously

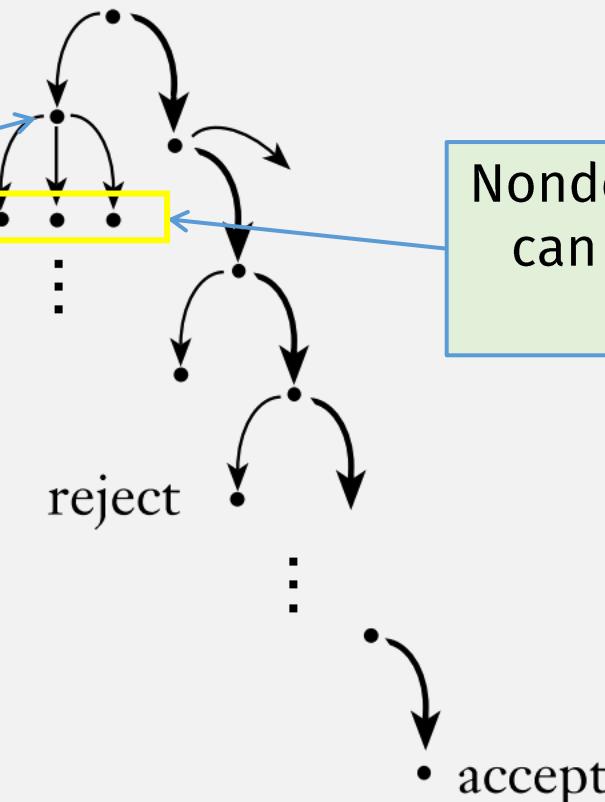
# Deterministic vs Nondeterministic

Deterministic  
computation



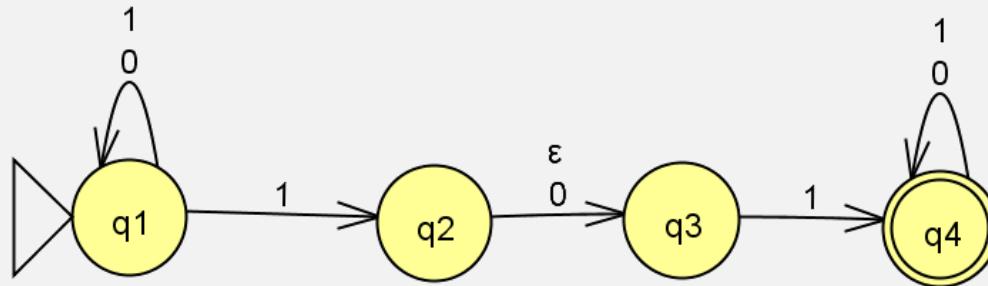
DFAs

Nondeterministic  
computation



NFA

# NFA Computation (JFLAP demo): 010110



# NFA Computation Sequence (of set of states)

Symbol read

0

1

0

1

1

0

$q_1$

Start

$q_1$

$q_2$

$q_3$

$q_3$

$q_4$

$q_4$

$q_4$

$q_4$

NFA accepts input if:  
at least one path  
ends in accept state

Each step can  
branch into  
multiple states at  
the same time!

So this is an accepting  
computation

# DFA Computation Rules

## *Informally*

Given

- A DFA (~ a “Program”)
- and **Input** = string of chars, e.g. “1101”

A DFA computation (~ “Program run”):

- Start in **start state**
- Repeat:
  - Read 1 char from **Input**, and
  - Change state according to *transition rules*

Result of computation:

- Accept if last state is **Accept state**
- Reject otherwise

## *Formally (i.e., mathematically)*

- $M = (Q, \Sigma, \delta, q_0, F)$
- $w = w_1 w_2 \cdots w_n$

A DFA **computation** is a sequence of states:

- specified by  $\hat{\delta}(q_0, w)$  where:

- $M$  accepts  $w$  if  $\hat{\delta}(q_0, w) \in F$
- $M$  rejects otherwise

# DFA Computation Rules

## *Informally*

Given

- A DFA (~ a “Program”)
- and Input = string of chars, e.g. “1101”

A DFA computation (~ “Program run”):

- Start in start state
- Repeat:
  - Read 1 char from Input, and
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  - $M$  rejects otherwise

# NFA Computation Rules

## *Informally*

Given

- An **NFA** (~ a “Program”)
- and **Input** = string of chars, e.g. “1101”

An **NFA computation** (~ “Program run”):

- **Start** in **start state**

- **Repeat**:

- Read 1 char from Input, and

For each “current” state, according to *transition rules*  
go to next states

... then combine all “next states”

### Result of computation:

- Accept if last **set of states has accept state**
- Reject otherwise

## *Formally (i.e., mathematically)*

- $M = (Q, \Sigma, \delta, q_0, F)$
- $w = w_1 w_2 \cdots w_n$

An **NFA computation** is a ...

- specified by  $\hat{\delta}(q_0, w)$  where:

- $M$  accepts  $w$  if ...
- $M$  rejects ...

# NFA Computation Rules

## *Informally*

Given

- An **NFA** (~ a “Program”)
- and **Input** = string of chars, e.g. “1101”

A DFA computation (~ “Program run”):

- Start in start state

- Repeat:

- Read 1 char from Input, and

For each “current” state,  
go to next states

according to *transition rules*

... then combine all “next states”

Result of computation:

- Accept if last **set of states** has accept state
- Reject otherwise

## *Formally (i.e., mathematically)*

- $M = (Q, \Sigma, \delta, q_0, F)$
- $w = w_1 w_2 \cdots w_n$

An **NFA computation** is a sequence of sets of states

- specified by  $\hat{\delta}(q_0, w)$  where:

???

- $M$  accepts  $w$  if ...
- $M$  rejects ...

# DFA Extended Transition Function

$$\hat{\delta} : Q \times \Sigma^* \rightarrow Q$$

- Domain (inputs):

- state  $q \in Q$  (doesn't have to be start state)
- string  $w = w_1 w_2 \cdots w_n$  where  $w_i \in \Sigma$

- Range (output):

- state  $q \in Q$  (doesn't have to be an accept state)

Recursive Input Data  
needs  
Recursive Function

Base case

$$\hat{\delta}(q, \varepsilon) =$$

Base case

A String is either:

- the **empty string** ( $\varepsilon$ ), or
- $xa$  (non-empty string)  
where
  - $x$  is a **string**
  - $a$  is a “char” in  $\Sigma$

# DFA Extended Transition Function

$$\hat{\delta} : Q \times \Sigma^* \rightarrow Q$$

- Domain (inputs):
  - state  $q \in Q$  (doesn't have to be start state)
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- Range (output):
  - state  $q \in Q$  (doesn't have to be an accept state)

Recursive Input Data  
needs  
Recursive Function

(Defined recursively)

Base case     $\hat{\delta}(q, \varepsilon) = q$

Recursive Case

$$\hat{\delta}(q, w' w_n) = \delta(\hat{\delta}(q, w'), w_n)$$

Recursion on string

where  $w' = w_1 \cdots w_{n-1}$

Recursive case

“second to last” state

A String is either:

- the **empty string** ( $\varepsilon$ ), or
- $xa$  (non-empty string)  
where

$x$  is a **string**  
 $a$  is a “char” in  $\Sigma$

Recursion  
on string

string    char

“smaller” argument

string    char

# DFA Extended Transition Function

$$\hat{\delta}: Q \times \Sigma^* \rightarrow Q$$

- Domain (inputs):
  - state  $q \in Q$  (doesn't have to be start state)
  - string  $w = w_1 w_2 \cdots w_n$  where  $w_i \in \Sigma$
- Range (output):
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Recursive Input Data  
needs  
Recursive Function

(Defined recursively)

Base case     $\hat{\delta}(q, \varepsilon) = q$

Recursive Case

$$\hat{\delta}(q, w' w_n) = \hat{\delta}(\hat{\delta}(q, w'), w_n)$$

where  $w' = w_1 \cdots w_{n-1}$

Single step from “second to last” state  
and last char gets to last state

A String is either:

- the **empty string** ( $\varepsilon$ ), or
- $xa$  (non-empty string)  
where
  - $x$  is a **string**
  - $a$  is a “char” in  $\Sigma$

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

## NFA

# Extended Transition Function

$$\hat{\delta}: Q \times \Sigma^* \rightarrow \mathcal{P}(Q)$$

- Domain (inputs):
  - state  $q \in Q$  (doesn't have to be start state)
  - string  $w = w_1 w_2 \cdots w_n$  where  $w_i \in \Sigma$
- Range (output):
  - states  $qs \subseteq Q$

Result is set of states

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

NFA

# Extended Transition Function

$$\hat{\delta}: Q \times \Sigma^* \rightarrow \mathcal{P}(Q)$$

- Domain (inputs):
  - state  $q \in Q$  (doesn't have to be start state)
  - string  $w = w_1 w_2 \cdots w_n$  where  $w_i \in \Sigma$
- Range (output):  
states  $qs \subseteq Q$

Result is set of states

(Defined recursively)

Base case

$$\hat{\delta}(q, \varepsilon) = \{q\}$$

Recursively Defined Input  
needs  
Recursive Function

Base case

A String is either:

- the **empty string** ( $\varepsilon$ ), or
- $xa$  (non-empty string)  
where
  - $x$  is a **string**
  - $a$  is a "char" in  $\Sigma$

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

NFA

# Extended Transition Function

$$\hat{\delta}: Q \times \Sigma^* \rightarrow \mathcal{P}(Q)$$

- Domain (inputs):

- state  $q \in Q$  (doesn't have to be start state)
- string  $w = w_1 w_2 \cdots w_n$  where  $w_i \in \Sigma$

- Range (output):

states  $qs \subseteq Q$

(Defined recursively)

Base case  $\hat{\delta}(q, \varepsilon) = \{q\}$

Recursive Case

$$\hat{\delta}(q, w' w_n) =$$

where  $w' = w_1 \cdots w_{n-1}$

$$\hat{\delta}(q, w') = \{q_1, \dots, q_k\}$$

Recursive case

A String is either:

- the **empty string** ( $\varepsilon$ ), or
- $xa$  (non-empty string) where

Recursive part

- $x$  is a **string**
- $a$  is a "char" in  $\Sigma$

"second to last" set of states

Recursion on recursive part

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

NFA

# Extended Transition Function

$$\hat{\delta}: Q \times \Sigma^* \rightarrow \mathcal{P}(Q)$$

- Domain (inputs):

- state  $q \in Q$  (doesn't have to be start state)
- string  $w = w_1 w_2 \cdots w_n$  where  $w_i \in \Sigma$

- Range (output):

states  $qs \subseteq Q$

(Defined recursively)

Base case  $\hat{\delta}(q, \varepsilon) = \{q\}$

Recursive Case

$$\hat{\delta}(q, w' w_n) = \bigcup_{i=1}^k \delta(q_i, w_n)$$

where  $w' = w_1 \cdots w_{n-1}$

For each “second to last” state, take single step on last char

Last char

$$\hat{\delta}(q, w') = \{q_1, \dots, q_k\}$$

Recursively Defined Input  
needs  
Recursive Function

A String is either:

- the **empty string** ( $\varepsilon$ ), or
- $xa$  (non-empty string)  
where
  - $x$  is a **string**
  - $a$  is a “char” in  $\Sigma$

# NFA

# Extended Transition Function

$$\hat{\delta}: Q \times \Sigma^* \rightarrow$$

- Domain (input)
  - state  $q \in Q$
  - string  $w = w_1 \dots w_n \in \Sigma^*$
- Range (output)
  - states  $qs \subseteq Q$

Given

- An NFA (~ a “Program”)
- and Input = string of chars, e.g. “1101”

A DFA computation (~ “Program run”):

- Start in start state

- Repeat:

- Read 1 char from Input, and

**For each “current” state,  
go to next states**

(Defined recursively)

... then combine all sets of “next states”

Recursive Case

$$\hat{\delta}(q, w' w_n) = \bigcup_{i=1}^k \delta(q_i, w_n)$$

where  $w' = w_1 \dots w_{n-1}$

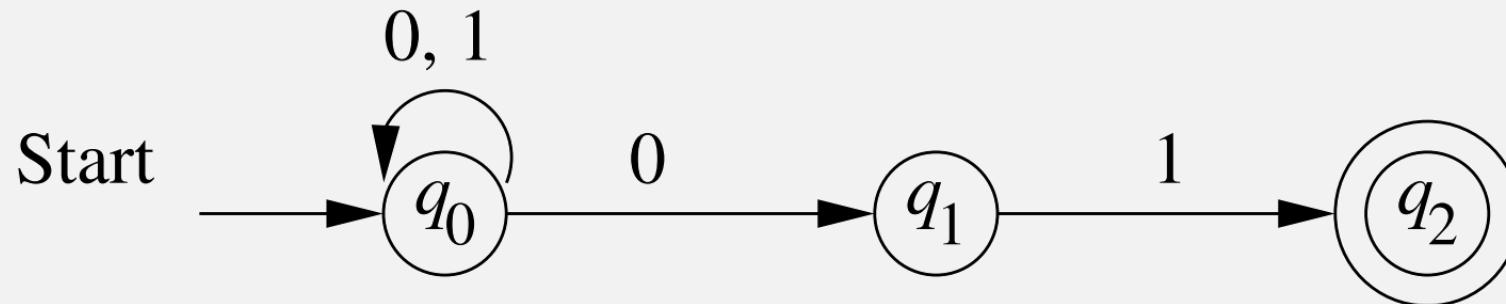
**Still ignoring  $\varepsilon$  transitions!**

Recursively Defined Input  
needs . . .

- the **empty string** ( $\varepsilon$ ), or
- $xa$  (non-empty string)  
where
  - $x$  is a string
  - $a$  is a “char” in  $\Sigma$

$$\hat{\delta}(q, w') = \{q_1, \dots, q_k\}$$

# NFA Extended $\delta$ Example



- $\hat{\delta}(q_0, \epsilon) = \{q_0\}$
- $\hat{\delta}(q_0, 0) = \delta(q_0, 0) = \{q_0, q_1\}$
- $\hat{\delta}(q_0, 00) = \delta(q_0, 0) \cup \delta(q_1, 0) = \{q_0, q_1\} \cup \emptyset = \{q_0, q_1\}$
- $\hat{\delta}(q_0, 001) = \delta(q_0, 1) \cup \delta(q_1, 1) = \{q_0\} \cup \{q_2\} = \{q_0, q_2\}$

Base case:  $\hat{\delta}(q, \epsilon) = \{q\}$

Recursive case:  $\hat{\delta}(q, w) = \bigcup_{i=1}^k \delta(q_i, w_n)$

where:  $\hat{\delta}(q, w_1 \cdots w_{n-1}) = \{q_1, \dots, q_k\}$

We haven't considered  
empty transitions!

Combine result of recursive call with “last step”

# Adding Empty Transitions

- Define the set  $\varepsilon\text{-REACHABLE}(q)$ 
  - ... to be all states reachable from  $q$  via zero or more empty transitions

(Defined recursively)

- **Base case:**  $q \in \varepsilon\text{-REACHABLE}(q)$

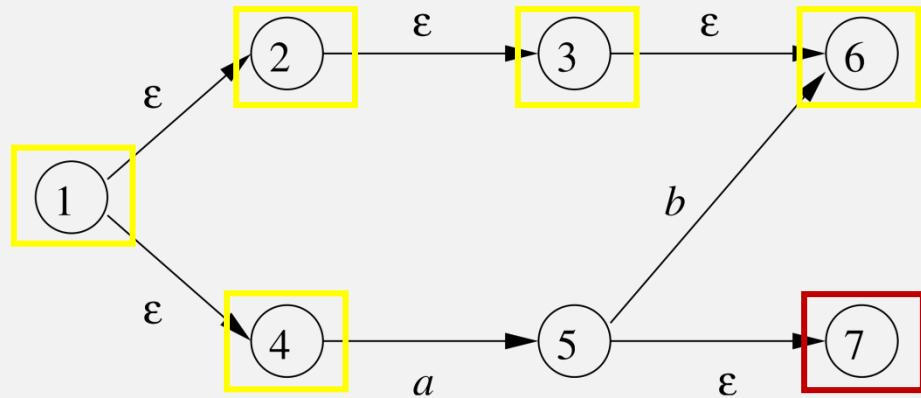
- **Inductive case:**

A state is in the reachable set if ...

$$\varepsilon\text{-REACHABLE}(q) = \{r \mid p \in \varepsilon\text{-REACHABLE}(q) \text{ and } r \in \delta(p, \varepsilon)\}$$

... there is an empty transition to it from another state in the reachable set

# $\varepsilon$ -REACHABLE Example



$$\varepsilon\text{-REACHABLE}(1) = \{1, 2, 3, 4, 6\}$$

**NFA**

# Extended Transition Function

$$\hat{\delta} : Q \times \Sigma^* \rightarrow \mathcal{P}(Q)$$

- Domain (inputs):
  - state  $q \in Q$  (doesn't have to be start state)
  - string  $w = w_1 w_2 \cdots w_n$  where  $w_i \in \Sigma$
- Range (output):
  - states  $qs \subseteq Q$

(Defined recursively)

Base case

$$\hat{\delta}(q, \varepsilon) = \text{\varepsilon-REACHABLE}(q)$$

Recursive Case

$$\hat{\delta}(q, w' w_n) =$$

where  $w' = w_1 \cdots w_{n-1}$   
 $\hat{\delta}(q, w') = \{q_1, \dots, q_k\}$

$$\bigcup_{i=1}^k \delta(q_i, w_n)$$

**NFA**

## Extended Transition Function

$$\hat{\delta} : Q \times \Sigma^* \rightarrow \mathcal{P}(Q)$$

- Domain (inputs):
  - state  $q \in Q$  (doesn't have to be start state)
  - string  $w = w_1 w_2 \cdots w_n$  where  $w_i \in \Sigma$
- Range (output):
  - states  $qs \subseteq Q$

(Defined recursively)

Base case  $\hat{\delta}(q, \varepsilon) = \varepsilon\text{-REACHABLE}(q)$

Recursive Case

“Take single step,  
then follow all  
empty transitions”

where  $w' = w_1 \cdots w_{n-1}$   
 $\hat{\delta}(q, w') = \{q_1, \dots, q_k\}$

$$\hat{\delta}(q, w' w_n) = \varepsilon\text{-REACHABLE}\left(\bigcup_{i=1}^k \delta(q_i, w_n)\right)$$

# Summary: NFA vs DFA Computation

## DFAs

- Can only be in one state
- Transition:
  - Must read 1 char
- Acceptance:
  - If final state is accept state

## NFAs

- Can be in multiple states
- Transition
  - Has empty transitions
- Acceptance:
  - If one of final states is accept state

# Is Concatenation Closed?

## **THEOREM**

The class of regular languages is closed under the concatenation operation.

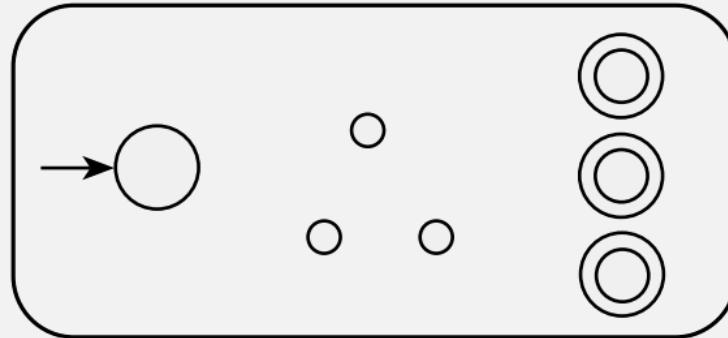
In other words, if  $A_1$  and  $A_2$  are regular languages then so is  $A_1 \circ A_2$ .

*Proof requires:* Constructing *new* machine

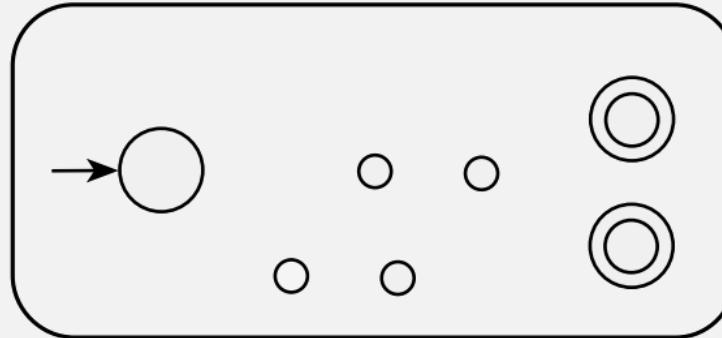
- How does it know when to switch machines?
  - Can only read input once

## Concatenation

$M_1$



$M_2$



Let  $M_1$  recognize  $A_1$ , and  $M_2$  recognize  $A_2$ .

Want: Construction of  $N$  to recognize  $A_1 \circ A_2$

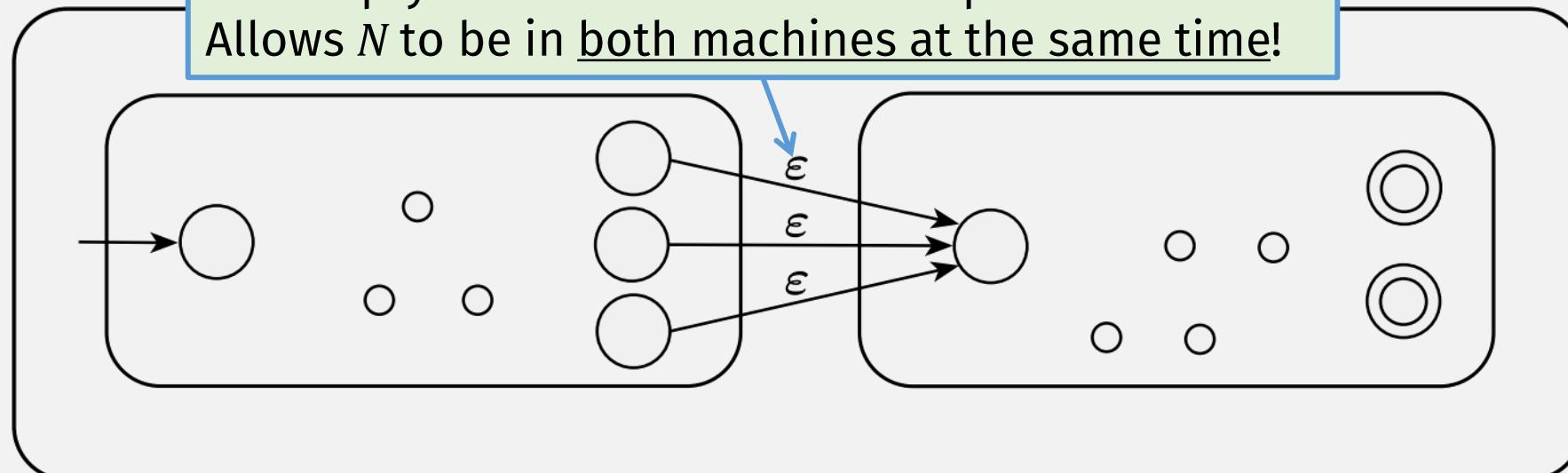
$N$

$\epsilon$  = “empty transition” = reads no input

Allows  $N$  to be in both machines at the same time!

$N$  is an **NFA**! It can:

- Keep checking 1<sup>st</sup> part with  $M_1$  and
- Move to  $M_2$  to check 2<sup>nd</sup> part



# Concatenation is Closed for Regular Langs

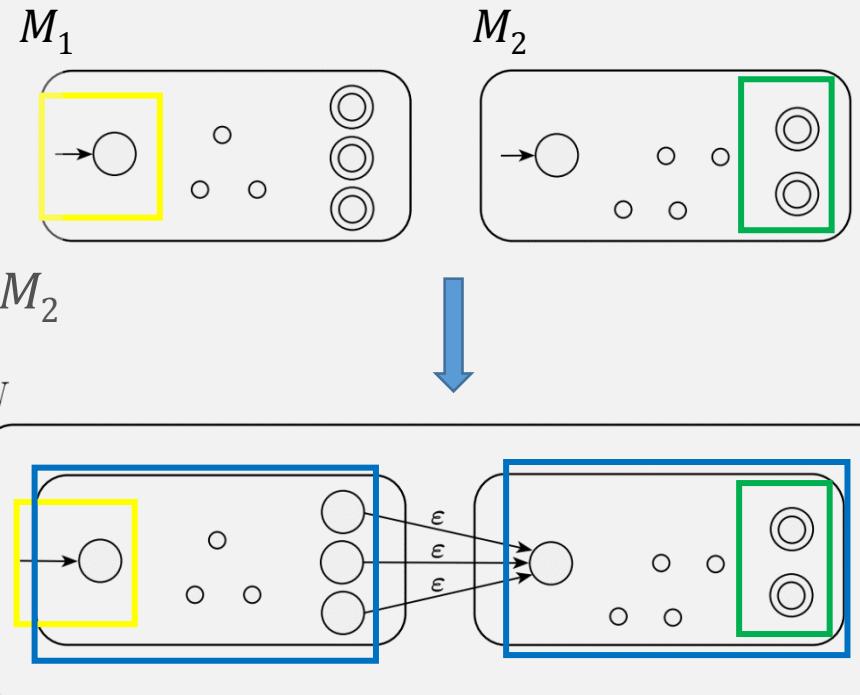
**PROOF** (part of)

Let DFA  $M_1 = (Q_1, \Sigma, \delta_1, q_1, F_1)$  recognize  $A_1$

DFA  $M_2 = (Q_2, \Sigma, \delta_2, q_2, F_2)$  recognize  $A_2$

Construct  $N = (Q, \Sigma, \delta, q_1, F_2)$  to recognize  $A_1 \circ A_2$

1.  $Q = Q_1 \cup Q_2$
2. The state  $q_1$  is the same as the start state of  $M_1$
3. The accept states  $F_2$  are the same as the accept states of  $M_2$
4. Define  $\delta$  so that for any  $q \in Q$  and any  $a \in \Sigma_\epsilon$ ,



# Concatenation is Closed for Regular Langs

**PROOF** (part of)

Let DFA  $M_1 = (Q_1, \Sigma, \delta_1, q_1, F_1)$  recognize  $A_1$

DFA  $M_2 = (Q_2, \Sigma, \delta_2, q_2, F_2)$  recognize  $A_2$

Construct  $N = (Q, \Sigma, \delta, q_1, F_2)$  to recognize  $A_1 \circ A_2$

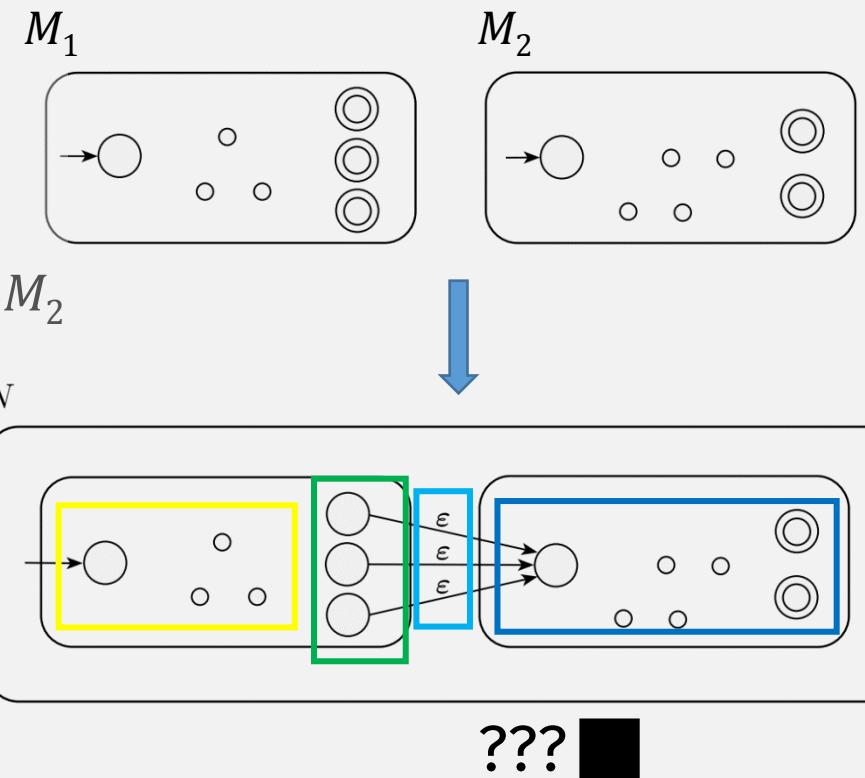
1.  $Q = Q_1 \cup Q_2$
2. The state  $q_1$  is the same as the start state of  $M_1$
3. The accept states  $F_2$  are the same as the accept states of  $M_2$
4. Define  $\delta$  so that for any  $q \in Q$  and any  $a \in \Sigma_\epsilon$ ,

$$\delta(q, a) = \begin{cases} \{\delta_1(q, a)\} & q \in Q_1 \text{ and } q \notin F_1 \\ \{\delta_1(q, a)\} & q \in F_1 \text{ and } a \neq \epsilon \\ ? & \{q_2\} \quad q \in F_1 \text{ and } a = \epsilon \\ \{\delta_2(q, a)\} & q \in Q_2. \end{cases}$$

NFA def says  $\delta$  must map every state and  $\epsilon$  to set of states

And:  $\delta(q, \epsilon) = \emptyset$ , for  $q \in Q, q \notin F_1$

Wait, is this true?



# Is Union Closed For Regular Langs?

Proof

## Statements

1.  $A_1$  and  $A_2$  are regular languages
2. A DFA  $M_1 = (Q_1, \Sigma, \delta_1, q_1, F_1)$  recognizes  $A_1$
3. A DFA  $M_2 = (Q_2, \Sigma, \delta_2, q_2, F_2)$  recognizes  $A_2$
4. Construct DFA  $M = (Q, \Sigma, \delta, q_0, F)$
5.  $M$  recognizes  $A_1 \cup A_2$
6.  $A_1 \cup A_2$  is a regular language
7. The class of regular languages is closed under the union operation.

## Justifications

1. Assumption
2. Def of Reg Lang (Coro)
3. Def of Reg Lang (Coro)
4. Def of DFA
5. See examples
6. Def of Regular Language
7. From stmt #1 and #6

In other words, if  $A_1$  and  $A_2$  are regular languages, so is  $A_1 \cup A_2$ .

Q.E.D.



# Is Concat Closed For Regular Langs?

Proof?

## Statements

1.  $A_1$  and  $A_2$  are regular languages
2. A DFA  $M_1 = (Q_1, \Sigma, \delta_1, q_1, F_1)$  recognizes  $A_1$
3. A DFA  $M_2 = (Q_2, \Sigma, \delta_2, q_2, F_2)$  recognizes  $A_2$
4. Construct **NFA**  $N = (Q, \Sigma, \delta, q_0, F)$
5.  $N$  recognizes  $A_1 \cup A_2$   $A_1 \circ A_2$
6.  $A_1 \cup A_2$   $A_1 \circ A_2$  is a regular language
7. The class of regular languages is closed under concatenation operation.

In other words, if  $A_1$  and  $A_2$  are regular languages then so is  $A_1 \circ A_2$ .

## Justifications

1. Assumption
2. Def of Reg Lang (Coro)
3. Def of Reg Lang (Coro)
4. Def of **NFA**
5. See examples
6. **???** Does NFA recognize reg langs?
7. From stmt #1 and #6

Q.E.D.?

*Previously*

# A DFA's Language

- For DFA  $M = (Q, \Sigma, \delta, q_0, F)$
- $M$  accepts  $w$  if  $\hat{\delta}(q_0, w) \in F$
- $M$  recognizes language  $\{w \mid M \text{ accepts } w\}$

Definition: A DFA's language is a **regular language**

# An NFA's Language?

- For NFA  $N = (Q, \Sigma, \delta, q_0, F)$ 
  - intersection
  - accept states
$$N \text{ accepts } w \text{ if } \hat{\delta}(q_0, w) \cap F \neq \emptyset$$
  - i.e., accept if final states contain at least one accept state
- Language of  $N = L(N) = \{w \mid \hat{\delta}(q_0, w) \cap F \neq \emptyset\}$

Q: What kind of languages do NFAs recognize?

# Concatenation Closed for Reg Langs?

- Combining DFAs to recognize concatenation of languages ...  
... produces an NFA
- So to prove concatenation is closed ...  
... we must prove that NFAs also recognize regular languages.

Specifically, we must prove:

NFAs  $\Leftrightarrow$  regular languages

# “If and only if” Statements

$$X \Leftrightarrow Y = “X \text{ if and only if } Y” = X \text{ iff } Y = X \Leftrightarrow Y$$

Represents two statements:

1.  $\Rightarrow$  if  $X$ , then  $Y$ 
  - “**forward**” direction
2.  $\Leftarrow$  if  $Y$ , then  $X$ 
  - “**reverse**” direction

# How to Prove an “iff” Statement

$$X \Leftrightarrow Y = "X \text{ if and only if } Y" = X \text{ iff } Y = X \Leftrightarrow Y$$

Proof has two (If-Then proof) parts:

1.  $\Rightarrow$  if  $X$ , then  $Y$ 
  - “**forward**” direction
  - assume  $X$ , then use it to prove  $Y$
2.  $\Leftarrow$  if  $Y$ , then  $X$ 
  - “**reverse**” direction
  - assume  $Y$ , then use it to prove  $X$