## Algorithms & Models of Computation CS/ECE 374, Spring 2019

# Non-deterministic Finite Automata (NFAs)

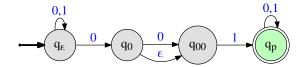
Lecture 4 Thursday, January 24, 2019

LATEXed: January 24, 2019 16:37

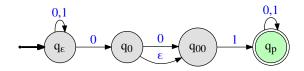
### Part I

### NFA Introduction

### Non-deterministic Finite State Automata (NFAs)



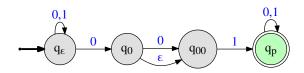
### Non-deterministic Finite State Automata (NFAs)



#### Differences from DFA

- From state q on same letter  $a \in \Sigma$  multiple possible states
- No transitions from q on some letters
- ε-transitions!

### Non-deterministic Finite State Automata (NFAs)

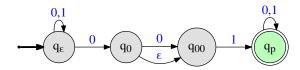


#### Differences from DFA

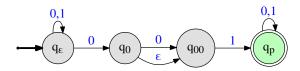
- From state q on same letter  $a \in \Sigma$  multiple possible states
- No transitions from q on some letters
- ε-transitions!

#### **Questions:**

- Is this a "real" machine?
- What does it do?

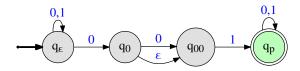


Machine on input string w from state q can lead to set of states (could be empty)



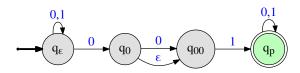
Machine on input string w from state q can lead to set of states (could be empty)

ullet From  $oldsymbol{q}_arepsilon$  on  $oldsymbol{1}$ 



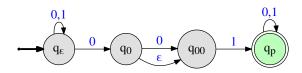
Machine on input string w from state q can lead to set of states (could be empty)

- From  $q_{\varepsilon}$  on 1
- From  $q_{\varepsilon}$  on  $\mathbf{0}$   $\{q_{\varepsilon}, q_{0}, q_{00}\}$



Machine on input string w from state q can lead to set of states (could be empty)

- From  $q_{\varepsilon}$  on 1
- From  $q_{\varepsilon}$  on 0
- From  $q_0$  on  $\varepsilon$   $\{q_0, q_0, g_0\}$

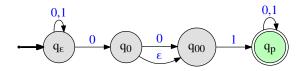


Machine on input string w from state q can lead to set of states (could be empty)

[92,90,900]

- From  $q_{\varepsilon}$  on 1
- From  $q_{\varepsilon}$  on 0
- ullet From  $oldsymbol{q}_0$  on  $oldsymbol{arepsilon}$
- ullet From  $oldsymbol{q}_arepsilon$  on  $oldsymbol{01}$

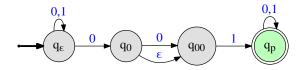
#### $\overline{\mathrm{NFA}}$ behavior



Machine on input string w from state q can lead to set of states (could be empty)

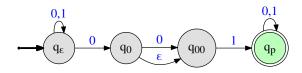
- From  $q_{\varepsilon}$  on 1
- ullet From  $oldsymbol{q}_arepsilon$  on  $oldsymbol{0}$
- ullet From  $oldsymbol{q}_0$  on arepsilon
- From  $q_{\varepsilon}$  on 01
- From  $q_{00}$  on 00

### NFA acceptance: informal



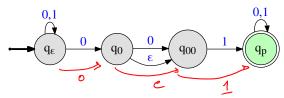
**Informal definition:** An NFA N accepts a string w iff some accepting state is reached by N from the start state on input w.

### NFA acceptance: informal

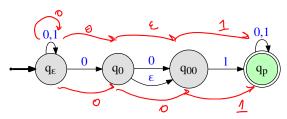


**Informal definition:** An NFA N accepts a string w iff some accepting state is reached by N from the start state on input w.

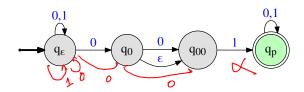
The language accepted (or recognized) by a NFA N is denote by L(N) and defined as:  $L(N) = \{w \mid N \text{ accepts } w\}$ .



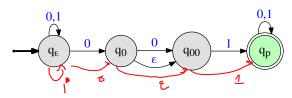
• Is **01** accepted?



- Is **01** accepted?  $\checkmark$
- Is **001** accepted? ✓

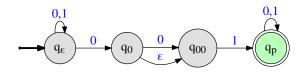


- Is **01** accepted?
- Is 001 accepted?
- Is 100 accepted?

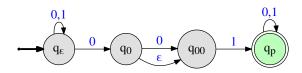


- Is **01** accepted?
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- Is 100 accepted?
- Are all strings in 1\*01 accepted?

- Is **01** accepted?
- Is 001 accepted?
- Is 100 accepted?
- Are all strings in 1\*01 accepted?
- What is the language accepted by N? (○ ↑1) (○ ←2) ↑ (○ ∤1)



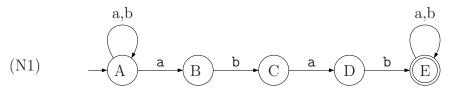
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- Are all strings in **1\*01** accepted?
- What is the language accepted by N?

**Comment:** Unlike DFAs, it is easier in NFAs to show that a string is accepted than to show that a string is **not** accepted.

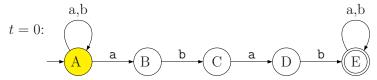
Example the first



Run it on input ababa.

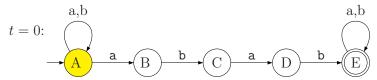
Idea: Keep track of the states where the NFA might be at any given time.

#### Example the first

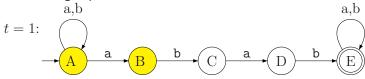


Remaining input: ababa.

#### Example the first

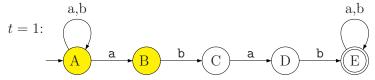


Remaining input: ababa.



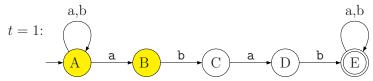
Remaining input: baba.

#### Example the first

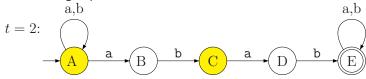


Remaining input: baba.

#### Example the first

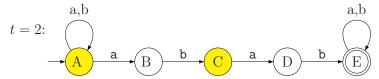


Remaining input: baba.



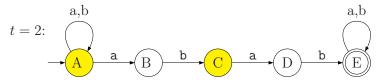
Remaining input: aba.

#### Example the first

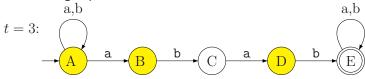


Remaining input: aba.

#### Example the first

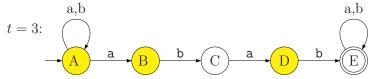


Remaining input: aba.



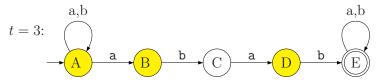
Remaining input: ba.

#### Example the first

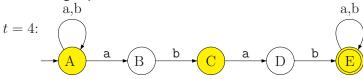


Remaining input: ba.

#### Example the first

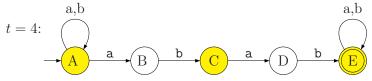


Remaining input: ba.



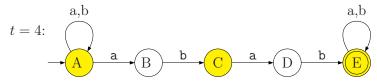
Remaining input: a.

#### Example the first

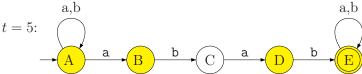


Remaining input: a.

#### Example the first

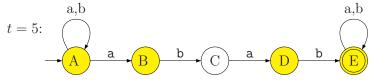


Remaining input: a.



Remaining input:  $\varepsilon$ .

#### Example the first



Remaining input:  $\varepsilon$ .

Accepts: ababa.

### Formal Tuple Notation

#### **Definition**

A non-deterministic finite automata (NFA)  $N = (Q, \Sigma, \delta, s, A)$  is a five tuple where

- Q is a finite set whose elements are called states,
- Σ is a finite set called the input alphabet,
- $\delta: Q \times \Sigma \cup \{\varepsilon\} \to \mathcal{P}(Q)$  is the transition function (here  $\mathcal{P}(Q)$  is the power set of Q),
- $s \in Q$  is the start state,
- $A \subseteq Q$  is the set of accepting/final states.

 $\delta(q, a)$  for  $a \in \Sigma \cup \{\varepsilon\}$  is a subset of Q — a set of states.

#### Reminder: Power set

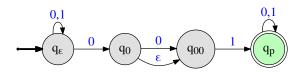
For a set Q its power set is:  $\mathcal{P}(Q) = 2^Q = \{X \mid X \subseteq Q\}$  is the set of all subsets of Q.

### Example

$$Q = \{1, 2, 3, 4\}$$

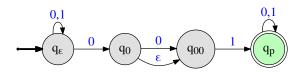
$$\mathcal{P}(Q) = \left\{ \begin{array}{c} \{1, 2, 3, 4\}, \\ \{2, 3, 4\}, \{1, 3, 4\}, \{1, 2, 4\}, \{1, 2, 3\}, \\ \{1, 2\}, \{1, 3\}, \{1, 4\}, \{2, 3\}, \{2, 4\}, \{3, 4\}, \\ \{1\}, \{2\}, \{3\}, \{4\}, \\ \{\} \end{array} \right\}$$

### Example

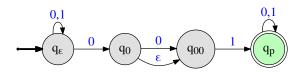




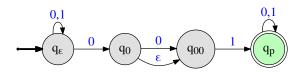
### Example



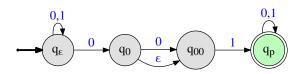
 $Q = \{q_{\varepsilon}, q_0, q_{00}, q_p\}$ 



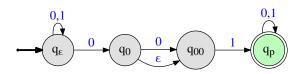
- $Q = \{q_{\varepsilon}, q_0, q_{00}, q_p\}$
- Σ =



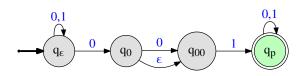
- $Q = \{q_{\varepsilon}, q_0, q_{00}, q_p\}$
- $\Sigma = \{0, 1\}$



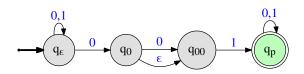
- $Q = \{q_{\varepsilon}, q_0, q_{00}, q_p\}$
- $\Sigma = \{0, 1\}$
- $\bullet$   $\delta$



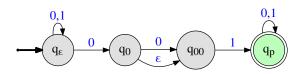
- $Q = \{q_{\varepsilon}, q_0, q_{00}, q_p\}$
- $\Sigma = \{0, 1\}$
- $\bullet$   $\delta$
- *s* =



- $Q = \{q_{\varepsilon}, q_0, q_{00}, q_p\}$
- $\Sigma = \{0, 1\}$
- $\bullet$   $\delta$
- $s = q_{\varepsilon}$

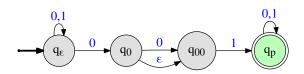


- $Q = \{q_{\varepsilon}, q_0, q_{00}, q_p\}$
- $\Sigma = \{0, 1\}$
- $\bullet$   $\delta$
- $s = q_{\varepsilon}$
- A =



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- $s = q_{\varepsilon}$
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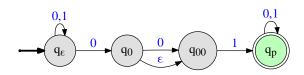
Transition function in detail...



$$\delta(q_{arepsilon},arepsilon) = \delta(q_0,arepsilon) = \delta(q_0,0) = \delta(q_0,1) = \delta(q_0,1) =$$

$$egin{aligned} \delta(q_{00},arepsilon) &= & & \delta(q_p,arepsilon) = \ \delta(q_{00},0) &= & \delta(q_p,0) = \ \delta(q_p,1) = \end{aligned}$$

Transition function in detail...



$$egin{aligned} \delta(q_arepsilon,arepsilon) &= \{q_arepsilon\} \ \delta(q_arepsilon,arepsilon) &= \{q_0,q_{00}\} \ \delta(q_arepsilon,0) &= \{q_{00}\} \ \delta(q_arepsilon,1) &= \{q_arepsilon\} \ \delta(q_0,1) &= \{\} \end{aligned}$$

$$egin{aligned} \delta(q_{00},arepsilon) &= \{q_{00}\} \ \delta(q_{00},0) &= \{\} \ \delta(q_{00},1) &= \{q_{p}\} \end{aligned} \qquad \qquad \delta(q_{p},arepsilon) &= \{q_{p}\} \ \delta(q_{00},1) &= \{q_{p}\} \end{aligned}$$

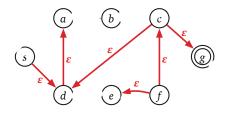
- **2**  $\delta(q, a)$ : set of states that N can go to from q on reading  $a \in \Sigma \cup \{\varepsilon\}$ .

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- **3** Want transition function  $\delta^*: Q \times \Sigma^* \to \mathcal{P}(Q)$

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- **3** Want transition function  $\delta^*: Q \times \Sigma^* \to \mathcal{P}(Q)$
- **1**  $\delta^*(q, w)$ : set of states reachable on input w starting in state q.

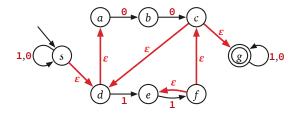
#### **Definition**

For NFA  $N = (Q, \Sigma, \delta, s, A)$  and  $q \in Q$  the  $\epsilon$ -reach(q) is the set of all states that q can reach using only  $\epsilon$ -transitions.



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- if w=a where  $a\in \Sigma$   $\delta^*(q,a)=\cup_{\underline{p}\in \epsilon{\sf reach}(q)}(\cup_{r\in \delta(\underline{p},a)}\epsilon{\sf reach}(r))$

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$$w = \varepsilon$$
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if 
$$w = a$$
 where  $a \in \Sigma$ 

$$\delta^*(q, a) = \bigcup_{p \in \epsilon \text{reach}(q)} (\bigcup_{r \in \delta(p, a)} \epsilon \text{reach}(r))$$

• if 
$$w = ax$$
,  $\delta^*(q, w) = \bigcup_{p \in \epsilon \operatorname{reach}(q)} (\bigcup_{r \in \delta(p, a)} \delta^*(r, x))$ 

# Formal definition of language accepted by N

#### **Definition**

A string w is accepted by NFA N if  $\delta_N^*(s, w) \cap A \neq \emptyset$ .

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The language L(N) accepted by a NFA  $N = (Q, \Sigma, \delta, s, A)$  is

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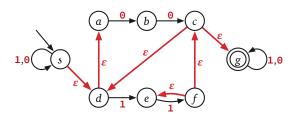
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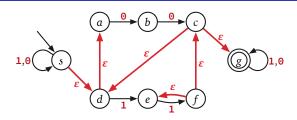
The language L(N) accepted by a NFA  $N = (Q, \Sigma, \delta, s, A)$  is

$$\{w \in \mathbf{\Sigma}^* \mid \delta^*(s, w) \cap A \neq \emptyset\}.$$

Important: Formal definition of the language of NFA above uses  $\delta^*$  and not  $\delta$ . As such, one does not need to include  $\varepsilon$ -transitions closure when specifying  $\delta$ , since  $\delta^*$  takes care of that.

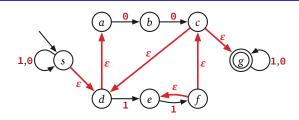


• 
$$\delta^*(s,\epsilon) = \text{greach}(s) = \{s,d,a\}$$



• 
$$\delta^*(s,\epsilon) = 4s, \lambda, \alpha'$$

• 
$$\delta^*(s, \epsilon) = \{s, b, a\}$$
  
•  $\delta^*(s, 0) = \{s, b, d; a\}$ 

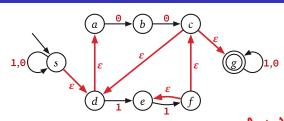


• 
$$\delta^*(s,\epsilon)$$

• 
$$\delta^*(s,0)$$

$$\delta^*(c,0) \quad \{c,9,d,a\}$$

$$= \{9,b\} \quad \text{of} \quad$$



$$\bullet$$
  $\delta^*(s,\epsilon)$ 

• 
$$\delta^*(s,0)$$

• 
$$\delta^*(c,0)$$

### Another definition of computation

#### **Definition**

 $q \xrightarrow{w}_{N} p$ : State p of NFA N is **reachable** from q on  $w \iff$  there exists a sequence of states  $r_0, r_1, \ldots, r_k$  and a sequence  $x_1, x_2, \ldots, x_k$  where  $x_i \in \Sigma \cup \{\varepsilon\}$ , for each i, such that:

- $\bullet$   $r_0 = q$
- for each i,  $r_{i+1} \in \delta(r_i, x_{i+1})$ ,
- $\bullet$   $r_k = p$ , and
- $\bullet \ \ w = x_1 x_2 x_3 \cdots x_k.$

#### Definition

$$\delta_{N}^{*}(q, w) = \{ p \in Q \mid q \xrightarrow{w}_{N} p \}.$$

# Why non-determinism?

- Non-determinism adds power to the model; richer programming language and hence (much) easier to "design" programs
- Fundamental in **theory** to prove many theorems
- Very important in practice directly and indirectly
- Many deep connections to various fields in Computer Science and Mathematics

Many interpretations of non-determinism. Hard to understand at the outset. Get used to it and then you will appreciate it slowly.

### Part II

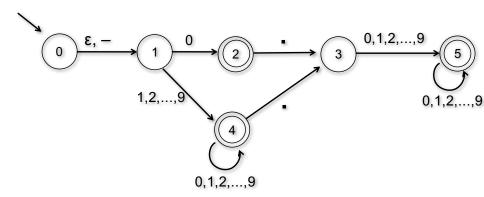
# Constructing NFAs

#### DFAs and NFAs

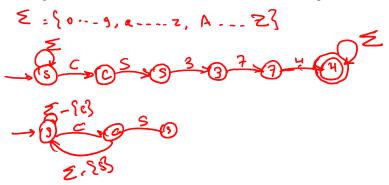
- Every DFA is a NFA so NFAs are at least as powerful as DFAs.
- NFAs prove ability to "guess and verify" which simplifies design and reduces number of states
- Easy proofs of some closure properties

Strings that represent decimal numbers.

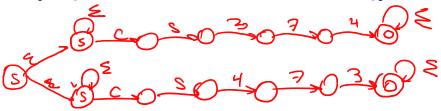
Strings that represent decimal numbers.



• {strings that contain CS374 as a substring}



- {strings that contain CS374 as a substring}
- {strings that contain CS374 or CS473 as a substring}



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- {strings that contain CS374 or CS473 as a substring}
- {strings that contain CS374 and CS473 as substrings}

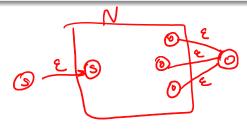
 $L_k = \{ \text{bitstrings that have a 1 } k \text{ positions from the end} \}$ DFA: Remember left  $k \text{ bits} \Rightarrow 2^k \text{ blades}$ NFA: k clates.

### A simple transformation

#### Theorem

For every NFA N there is another NFA N' such that L(N) = L(N') and such that N' has the following two properties:

- ullet N' has single final state f that has no outgoing transitions
- The start state **s** of **N** is different from **f**



### Part III

# Closure Properties of NFAs

### Closure properties of NFAs

Are the class of languages accepted by NFAs closed under the following operations?

- union
- intersection
- concatenation
- Kleene star
- complement

### Closure under union

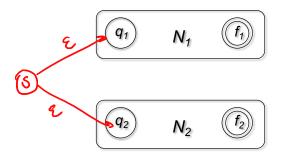
### Theorem

For any two NFAs  $N_1$  and  $N_2$  there is a NFA N such that  $L(N) = L(N_1) \cup L(N_2)$ .

### Closure under union

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### Closure under concatenation

### Theorem

For any two NFAs  $N_1$  and  $N_2$  there is a NFA N such that  $L(N) = L(N_1) \cdot L(N_2)$ .

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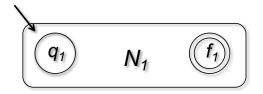
### Closure under concatenation

#### **Theorem**

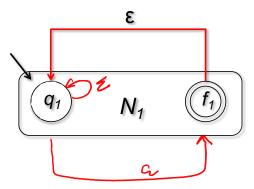
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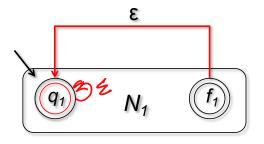
#### Theorem



### **Theorem**

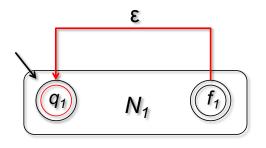


#### **Theorem**



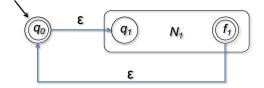
#### **Theorem**

For any NFA  $N_1$  there is a NFA N such that  $L(N) = (L(N_1))^*$ .



Does not work! Why?

#### Theorem



### Part IV

NFAs capture Regular Languages

## Regular Languages Recap

### Regular Languages

```
\emptyset regular \{\epsilon\} regular \{a\} regular for a \in \Sigma R_1 \cup R_2 regular if both are R_1R_2 regular if both are R^* is regular if R is
```

### Regular Expressions

```
\emptyset denotes \emptyset
\epsilon denotes \{\epsilon\}
a denote \{a\}
\mathbf{r}_1 + \mathbf{r}_2 denotes R_1 \cup R_2
\mathbf{r}_1\mathbf{r}_2 denotes R_1R_2
\mathbf{r}^* denote R^*
```

Regular expressions denote regular languages — they explicitly show the operations that were used to form the language

#### **Theorem**

For every regular language L there is an NFA N such that L = L(N).

### Theorem

For every regular language L there is an NFA N such that L = L(N).

### Proof strategy:

- For every regular expression r show that there is a NFA N such that L(r) = L(N)
- Induction on length of r

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Base cases:  $\emptyset$ ,  $\{\varepsilon\}$ ,  $\{a\}$  for  $a \in \Sigma$ .

- For every regular expression r show that there is a NFA N such that L(r) = L(N)
- Induction on length of r

#### Inductive cases:

•  $r_1, r_2$  regular expressions and  $r = r_1 + r_2$ .

- For every regular expression r show that there is a NFA N such that L(r) = L(N)
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#### Inductive cases:

•  $r_1$ ,  $r_2$  regular expressions and  $r = r_1 + r_2$ . By induction there are NFAs  $N_1$ ,  $N_2$  s.t  $L(N_1) = L(r_1)$  and  $L(N_2) = L(r_2)$ .

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- $r = r_1 \cdot r_2$ . Use closure of NFA languages under concatenation
- $r = (r_1)^*$ . Use closure of NFA languages under Kleene star

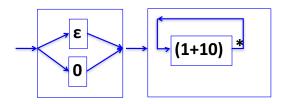
$$(\epsilon+0)(1+10)^*$$

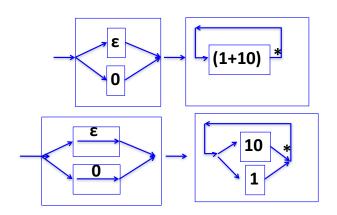
$$\longrightarrow (\epsilon+0) \longrightarrow (1+10)^*$$

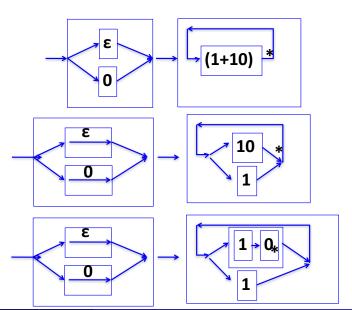
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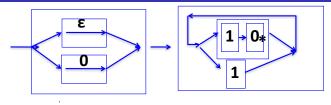
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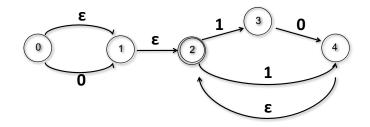
$$\downarrow 0 \qquad \downarrow (1+10)$$











Final NFA simplified slightly to reduce states