

# 91.304 Foundations of (Theoretical) Computer Science

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Chapter 1 Lecture Notes (Section 1.3: Regular Expressions)

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with some modifications by Prof. Karen Daniels, Spring 2012



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# Regular expressions

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- ❑ You might be familiar with these.
- ❑ Example: `"^int .*\(.*\);"` is a (flex format) regular expression that appears to match C function prototypes that return ints.
- ❑ In our treatment, a regular expression is a **program** that generates a **language** of matching strings when you "run it".
- ❑ We will use a very compact definition that simplifies things later.

# Regular expressions

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- **Definition.** Let  $\Sigma$  be an alphabet not containing any of the special characters in this list:  $\varepsilon \ \emptyset \ ) \ ( \cup \cdot \ *$

We define the syntax of the (programming) language  $\text{REX}(\Sigma)$ , abbreviated as  $\text{REX}$ , inductively:

- **Base cases**

1. For all  $a \in \Sigma$ ,  $a \in \text{REX}$ . In other words, each single character from  $\Sigma$  is a regular expression all by itself.
2.  $\varepsilon \in \text{REX}$ . In other words, the literal symbol  $\varepsilon$  is a regular expression. In this context it is *not* the empty string but rather the single-character *name* for the empty string.
3.  $\emptyset \in \text{REX}$ . Similarly, the literal symbol  $\emptyset$  is a regular expression.

Notes:

-REX is not defined in our textbook, but is helpful in continuing to build our diagram of languages.

-In our textbook, **a** represents language  $\{a\}$ ,  $\varepsilon$  represents language  $\{\varepsilon\}$ .

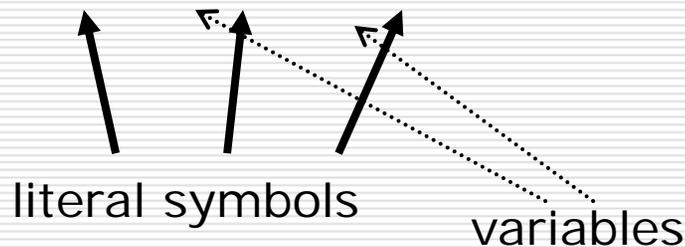
# Regular expressions

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## □ Definition continued

### ■ Induction cases

4. For all  $r_1, r_2 \in \text{REX}$ ,  
 $( r_1 \cup r_2 ) \in \text{REX}$  also



5. For all  $r_1, r_2 \in \text{REX}$ ,  
 $( r_1 \cdot r_2 ) \in \text{REX}$  also

Note: Later we remove dot, which is denoted by empty circle in textbook (later also removed).

# Regular expressions

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- Definition continued
  - Induction cases continued
    - 6. For all  $r \in \text{REX}$ ,  
(  $r^*$  )  $\in \text{REX}$  also
  
- Examples over  $\Sigma = \{0, 1\}$ 
  - $\varepsilon$  and 0 and 1 and  $\emptyset$
  - $((1 \cdot 0) \cdot (\varepsilon \cup \emptyset))^*$
  - $\varepsilon\varepsilon$  is *not* a regular expression
    - Remember, in the context of regular expressions,  $\varepsilon$  and  $\emptyset$  are ordinary characters

Note: Textbook also defines  $R^+ = R R^*$ , where  $R$  is a regular expression.

# Semantics of regular expressions

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- **Definition.** We define the meaning of the language  $\text{REX}(\Sigma)$  inductively using the  $L()$  operator so that  $L(r)$  denotes the **language generated by**  $r$  as follows:
  - **Base cases**
    1. For all  $a \in \Sigma$ ,  $L(a) = \{ a \}$ . *A single-character regular expression generates the corresponding single-character string.*
    2.  $L(\varepsilon) = \{ \varepsilon \}$ . *The symbol for the empty string actually generates the empty string.*
    3.  $L(\emptyset) = \emptyset$ . *The symbol for the empty language actually generates the empty language.*

# Regular expressions

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- Definition continued
  - **Induction cases**
    4. For all  $r_1, r_2 \in \text{REX}$ ,  
 $L( (r_1 \cup r_2) ) = L(r_1) \cup L(r_2)$
    5. For all  $r_1, r_2 \in \text{REX}$ ,  
 $L( (r_1 \cdot r_2) ) = L(r_1) \cdot L(r_2)$
    6. For all  $r \in \text{REX}$ ,  
 $L( ( r^* ) ) = (L(r))^*$
  - **No other string is in  $\text{REX}(\Sigma)$**
- Example
  - $L( ( (1 \cdot 0) \cdot (\epsilon \cup 0) )^* )$  includes  
 $\epsilon, 10, 1010, 101010, 10101010, \dots$

# Orientation

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- We used highly flexible mathematical notation and state-transition diagrams to specify DFAs and NFAs
- Now we have a precise programming language REX that generates languages
- REX is designed to **close the simplest languages under  $\cup, *, \cdot$**

# Abbreviations

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- Instead of parentheses, we use precedence to indicate grouping when possible.
  - \* (highest)
  - .
  - $\cup$  (lowest)
- Instead of  $\cdot$ , we just write elements next to each other
  - Example:  $((1 \cdot 0) \cdot (\epsilon \cup \emptyset))^*$  can be written as  $(10(\epsilon \cup \emptyset))^*$
- If  $r \in \text{REX}(\Sigma)$ , instead of writing  $rr^*$ , we write  $r^+$

# Abbreviations

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- Instead of writing a union of all characters from  $\Sigma$  together to mean "any character", we just write  $\Sigma$ 
  - In a flex/grep regular expression this would be called "."
- Instead of writing  $L(r)$  when  $r$  is a regular expression, we consider  $r$  alone to simultaneously mean both the expression  $r$  and the language it generates, relying on context to disambiguate

# Abbreviations

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- Caution: regular expressions are *strings* (programs). They are equal *only when* they contain exactly the same sequence of characters.
  - $((1 \cdot 0) \cdot (\epsilon \cup \emptyset))^*$  can be *abbreviated*  $(10(\epsilon \cup \emptyset))^*$
  - however  $((1 \cdot 0) \cdot (\epsilon \cup \emptyset))^* \neq (10(\epsilon \cup \emptyset))^*$  as strings
  - but  $((1 \cdot 0) \cdot (\epsilon \cup \emptyset))^* = (10(\epsilon \cup \emptyset))^*$  when they are considered to be the generated languages
- more accurately then,  
$$L( ((1 \cdot 0) \cdot (\epsilon \cup \emptyset))^* ) = L( (10(\epsilon \cup \emptyset))^* )$$
$$= L( (10)^* )$$

# Examples

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- Find a regular expression for  $\{ w \in \{0,1\}^* \mid w \neq 10 \}$
- Find a regular expression for  $\{ x \in \{0,1\}^* \mid \text{the 6}^{\text{th}} \text{ digit counting from the rightmost character of } x \text{ is } 1 \}$
- Find a regular expression for  $L_3 = \{ x \in \{0,1\}^* \mid \text{the binary number } x \text{ is a multiple of } 3 \}$

*(foreshadowing: can be done by starting with DFA and then ripping states)*

# Facts

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- $\text{REX}(\Sigma)$  is itself a language over an alphabet  $\Gamma$  that is

$$\Gamma = \Sigma \cup \{ \text{ ) , ( , \cdot , * , \varepsilon , \emptyset \}$$

- For every  $\Sigma$ ,  $|\text{REX}(\Sigma)| = \infty$

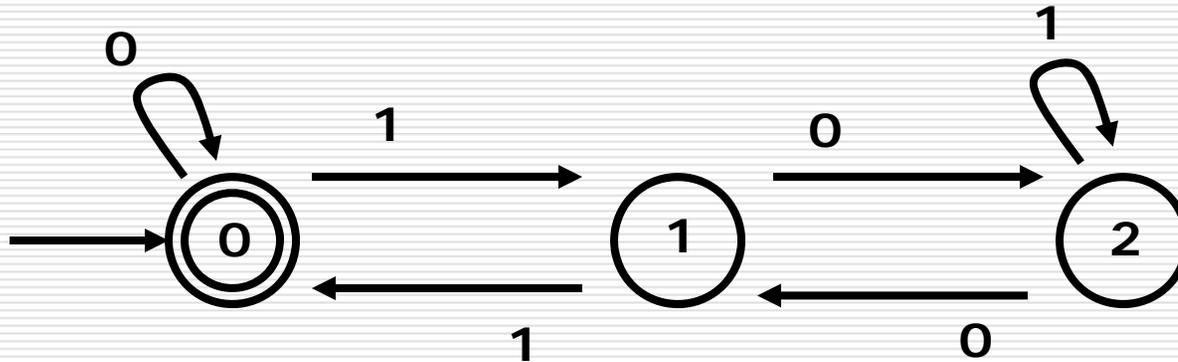
$$\emptyset, (\emptyset^*), ((\emptyset^*)^*), \dots$$

even without knowing  $\Sigma$  there are infinitely many elements in  $\text{REX}(\Sigma)$

- Question: Can we find a DFA or NFA  $M$  with  $L(M) = \text{REX}(\Sigma)$ ?

# The DFA for $L_3$

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Regular expression:  
 $(0 \cup 1 \underline{(0 1^* 0)^*} 1)^*$

(Recall precedence of operators.)

# Regular expression for $L_3$

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- $(0 \cup 1 (0 1^* 0)^* 1)^*$
- $L_3$  is closed under concatenation, because of the overall form  $( )^*$
- Now suppose  $x \in L_3$ . Is  $x^R \in L_3$ ?
  - Yes: see this is by reversing the regular expression and observing that the same regular expression results
  - So  $L_3$  is also closed under reversal

# Equivalence with Finite Automata

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**Theorem 1.54** A language is regular if and only if some regular expression describes it.

**Proof: 2 directions**

**Lemma 1.55:** If a language is described by a regular expression, then it is regular.  
(Proof idea: Convert to an NFA.)

**Lemma 1.60:** If a language is regular, then it is described by a regular expression.  
(Proof idea: Convert from DFA to GNFA to regular expression.)

# Regular expressions generate regular languages

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**Lemma 1.55** For every regular expression  $r$ ,  $L(r)$  is a regular language.

**Proof** by induction on regular expressions.

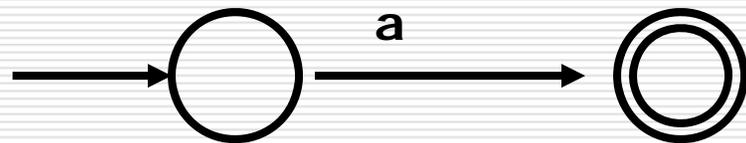
- We used induction to create all of the regular expressions and then to define their languages, so we can use induction to visit each one and prove a property about it

# $L(\text{REG}) \subseteq \text{REG}$

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## Base cases:

1. For every  $a \in \Sigma$ ,  $L(a) = \{ a \}$  is obviously regular:



2.  $L(\varepsilon) = \{ \varepsilon \} \in \text{REG}$  also
3.  $L(\emptyset) = \emptyset \in \text{REG}$

# $L(\text{REG}) \subseteq \text{REG}$

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## Induction cases:

4. Suppose the induction hypothesis holds for  $r_1$  and  $r_2$ . Namely,  $L(r_1) \in \text{REG}$  and  $L(r_2) \in \text{REG}$ . We want to show that  $L(r_1 \cup r_2) \in \text{REG}$  also. But look: by definition,

$$L(r_1 \cup r_2) = L(r_1) \cup L(r_2)$$

Since both of these languages are regular, we can apply Theorem 1.45 (closure of REG under  $\cup$ ) to conclude that their union is regular.

# $L(\text{REX}) \subseteq \text{REG}$

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## Induction cases:

5. Now suppose  $L(r_1) \in \text{REG}$  and  $L(r_2) \in \text{REG}$ .

By definition,

$$L(r_1 \cdot r_2) = L(r_1) \cdot L(r_2)$$

By Theorem 1.47 (closure of REG under  $\cdot$ ), this concatenation is regular too.

6. Finally, suppose  $L(r) \in \text{REG}$ . Then by definition,

$$L(r^*) = (L(r))^*$$

By Theorem 1.49 (closure of REG under  $^*$ ), this language is also regular. **QED**

# On to $REG \subseteq L(REX)$

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- Now we'll show that each regular language (one accepted by an automaton) also can be described by a regular expression
  - Hence  $REG = L(REX)$
  - In other words, regular expressions are equivalent in power to finite automata
- This equivalence is called **Kleene's Theorem** (Theorem 1.54 in book)

# Converting DFAs to REX

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- ❑ Lemma 1.60 in textbook
- ❑ This approach uses yet another form of finite automaton called a **GNFA** (generalized NFA)
- ❑ The technique is easier to understand by working an example than by studying the proof

# Syntax of GNFA

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- A **generalized NFA** is a 5-tuple  $(Q, \Sigma, \delta, q_s, q_a)$  such that
  1.  $Q$  is a *finite* set of states
  2.  $\Sigma$  is an alphabet
  3.  $\delta: (Q - \{q_a\}) \times (Q - \{q_s\}) \rightarrow \text{REX}(\Sigma)$  is the transition function
  4.  $q_s \in Q$  is the start state
  5.  $q_a \in Q$  is the (one) accepting state

# GNFA syntax summary

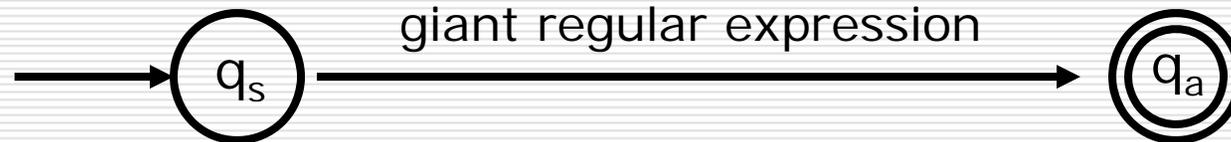
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- Arcs are labeled with regular expressions
  - Meaning is that "input matching the label moves from old state to new state" -- just like NFA, but not just a single character at a time
- Start state has no incoming transitions, accept has no outgoing
- Every pair of states (except start & accept) has two arcs between them
  - Every state has a self-loop (except start & accept)

# Construction strategy

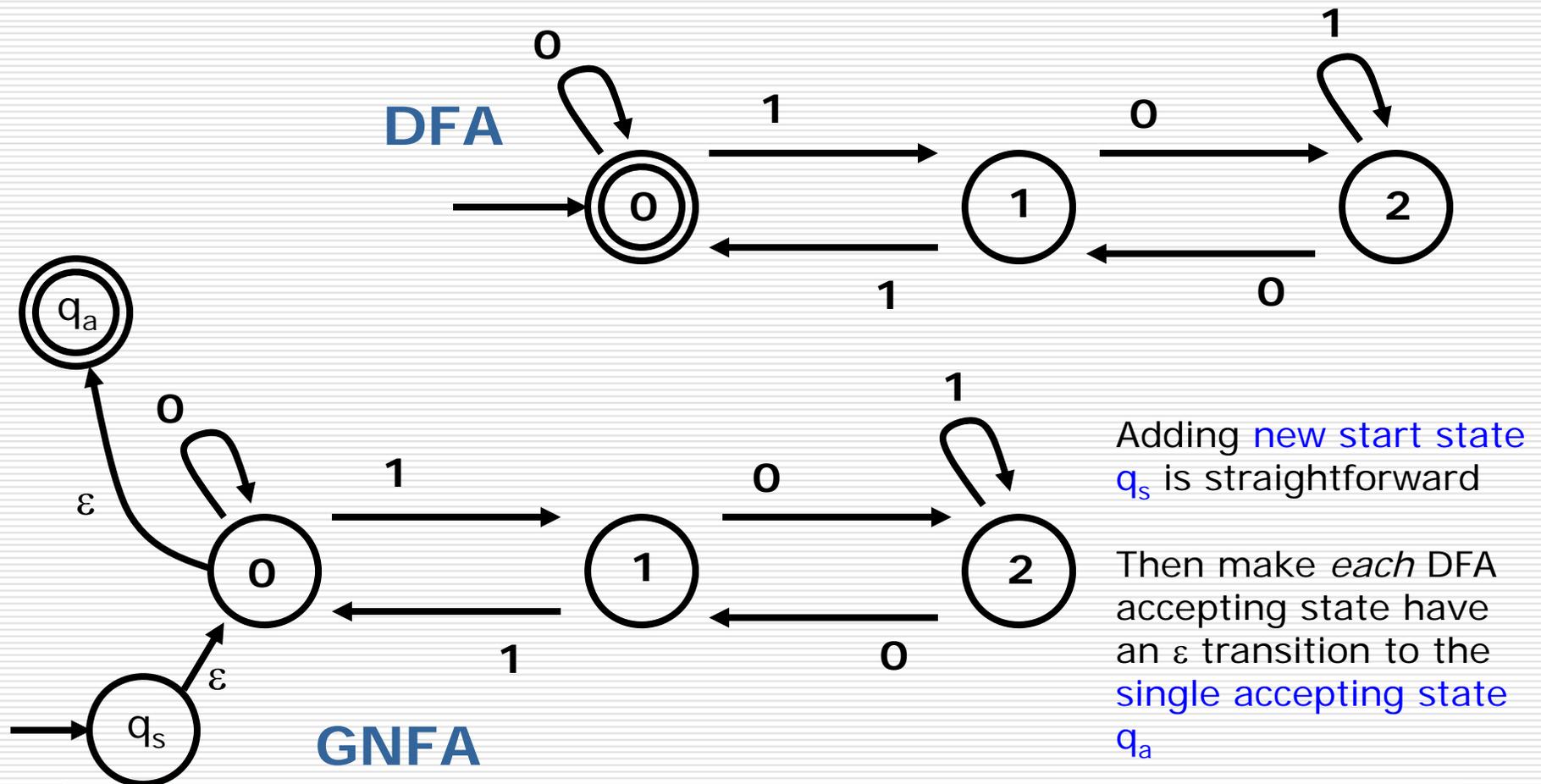
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- Will convert a DFA into a GNFA then iteratively shrink the GNFA until we end up with a diagram like this:



meaning that exactly that input that matches the giant regular expression is in the language

# Converting DFA to GNFA



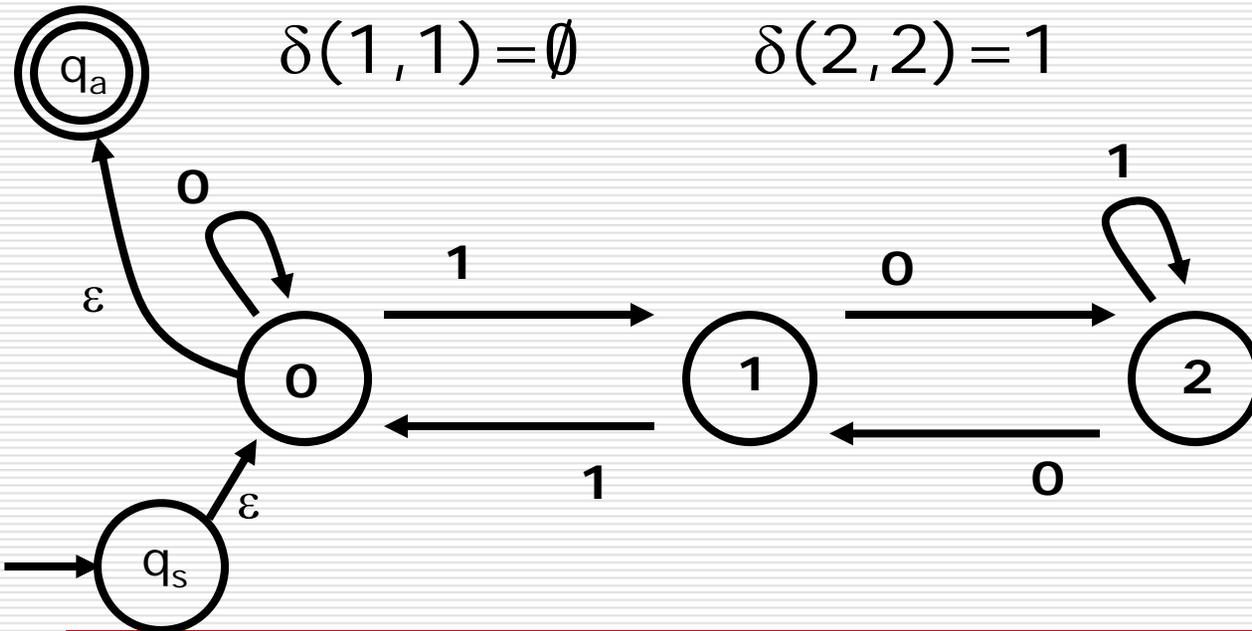
Note:  $\emptyset$  transitions are not drawn here for sake of clarity, but can be important later on.

# Interpreting arcs

$$\delta: (Q - \{q_a\}) \times (Q - \{q_s\}) \rightarrow \text{REX}(\Sigma)$$

In this diagram, for example,

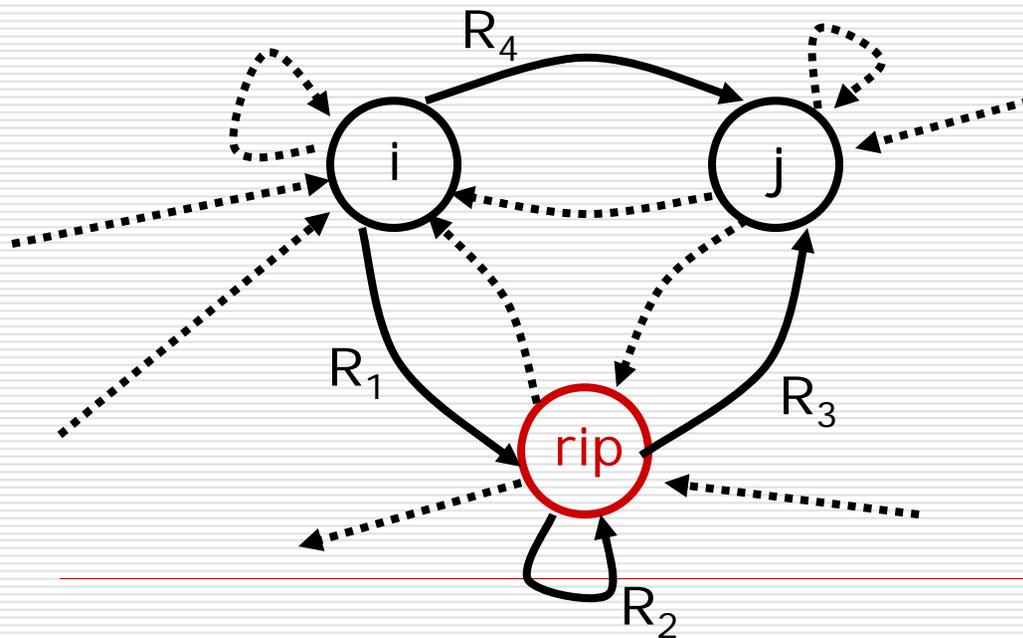
$$\begin{array}{lll} \delta(0,1) = 1 & \delta(2,0) = \emptyset & \delta(2,q_a) = \emptyset \\ \delta(1,1) = \emptyset & \delta(2,2) = 1 & \delta(0,q_a) = \varepsilon \end{array}$$



# Eliminating a GNFA state

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- We arbitrarily choose an interior state (not  $q_s$  or  $q_a$ ) to **rip** out of the machine



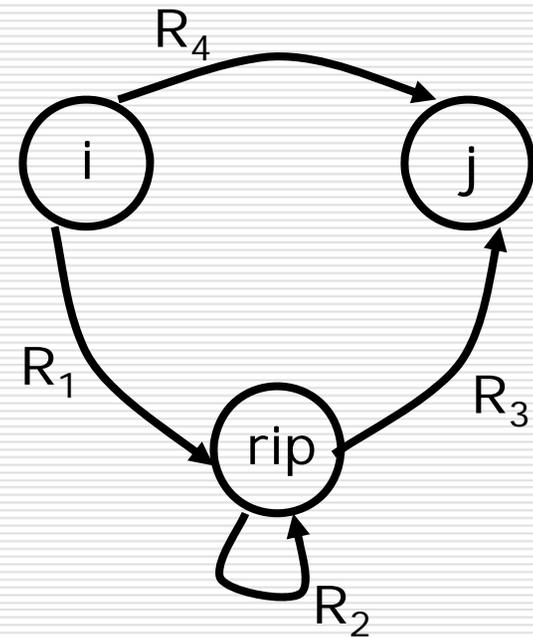
**Question:** how is the ability of state  $i$  to get to state  $j$  affected when we remove  $rip$ ?

Only the **solid** and **labeled** states and transitions are relevant to that question

# Eliminating a GNFA state

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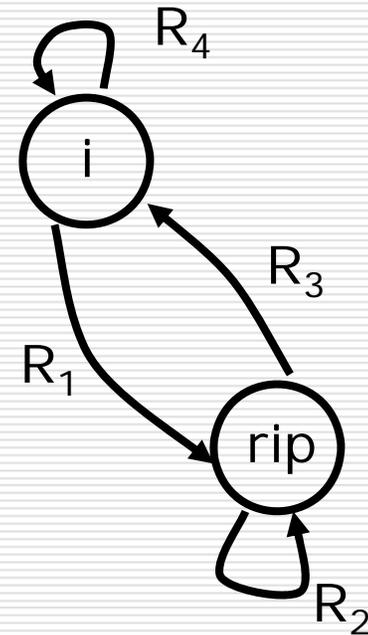
- We produce a new GNFA that omits rip
  - Its i-to-j label will compensate for the missing state
  - We will do this for **every**  $(i,j) \in (Q - \{q_a\}) \times (Q - \{q_s\})$
  - So we have to rewrite **every label** in order to eliminate this one state
  - New label for i-to-j is  $R_4 \cup (R_1 \cdot (R_2)^* \cdot R_3)$



# Don't overlook

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- The case  $(i, i) \in (Q - \{q_a\}) \times (Q - \{q_s\})$
- New label for i-to-i is still  $R_4 \cup (R_1 \cdot (R_2)^* \cdot R_3)$
- Example proceeds on whiteboard, but first we'll do textbook p. 75 (Figure 1.67) for a simpler one.



# g/re/p

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- What does grep do?

$(\text{int} \mid \text{float})\_rec.^*emp$  *becomes*  
 $(\Sigma^*)(\text{int} \cup \text{float})\_rec(\Sigma^*)emp(\Sigma^*)$

- What does it mean?

- How does it work?

- Regular expression  $\rightarrow$  NFA  $\rightarrow$  DFA  $\rightarrow$  state reduction
- Then run DFA against each line of input, printing out the lines that it accepts

# State machines

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- Very common programming technique

```
while (true) {  
    switch (state) {  
        case NEW_CONNECTION:  
            process_login();  
            state=RECEIVE_CMD;  
            break;  
        case RECEIVE_CMD:  
            if (process_cmd() == CMD_QUIT)  
                state=SHUTDOWN;  
            break;  
        case SHUTDOWN:  
            ...  
    }  
    ...  
}
```

# This chapter so far

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§1.1: Introduction to languages & DFAs

§1.2: NFAs and DFAs recognize the same class of languages

§1.3: REX generates the same class of languages

□ Three different programming "languages" specified in different levels of formality that solve the same types of computational problems

■ Four, if you count GNFA's

# Strategies

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- If you're investigating a property of regular languages, then as soon as you know  $L \in \text{REG}$ , you know there are DFAs, NFAs, Regexes that describe it. Use whatever representation is convenient
- But sometimes you're investigating the properties of the programs themselves: changing states, adding a  $*$  to a regex, etc. Then the knowledge that other representations exist might be relevant and might not

# All finite languages are regular

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**Theorem** (not in book)  $\text{FIN} \subseteq \text{REG}$

**Proof** Suppose  $L \in \text{FIN}$ .

Then either  $L = \emptyset$ , or  $L = \{ s_1, s_2, \dots, s_n \}$   
where  $n \in \mathcal{N}$  and each  $s_i \in \Sigma^*$ .

A regular expression describing  $L$  is,  
therefore, either  $\emptyset$  or

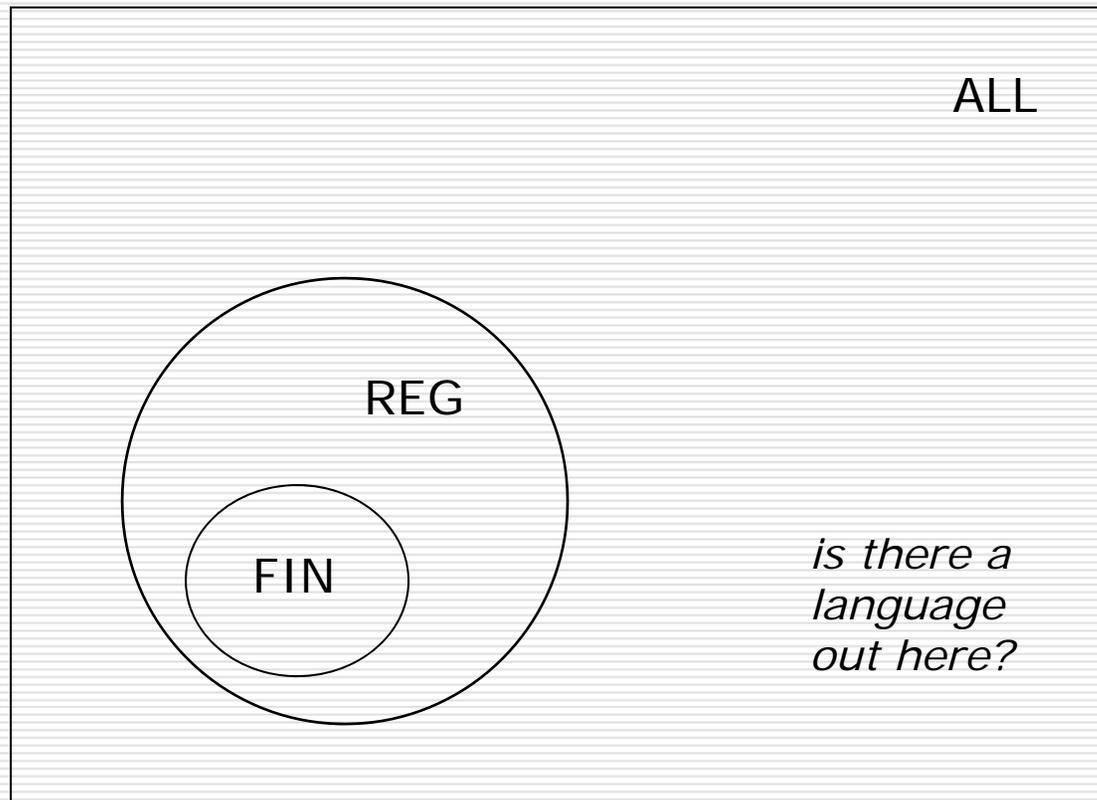
$s_1 \cup s_2 \cup \dots \cup s_n$       **QED**

**Note that** this proof does not work for  
 $n = \infty$

# Picture so far

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Each point is a language in this Venn diagram



REG = L(DFA)  
= L(NFA)  
= L(REX)  
= L(GNFA)  
≠ FIN

*is there a language out here?*

---

"the class of languages generated by DFAs"