# Foundations of Computing 

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Lecture 5
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## Outline

## (1) Lecture 4 Review

## (2) Regular Expressions

(3) Regular Expressions $==$ Regular Languages
(4) Properties of Regular Expressions

## Lecture 4 Review

- More NFAs
- Equivalence of NFAs and DFAs
- NFAs for union, composition, and star - closure of regular languages


## Outline

## (1) Lecture 4 Review

## (2) Regular Expressions

## (3) Regular Expressions $==$ Regular Languages

4 Properties of Regular Expressions

## Regular Expressions

- Strings that describe a language


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- Parentheses
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## You've seen this before

Regular expressions very useful in compilers, and string search (e.g., grep)

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(0. $\left(R_{1}^{*}\right)$ - 0 or more repetitions of $R_{1}$ where $R_{1}$ is a regular expression

## Some More Examples

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- $(0 \cup \epsilon)(1 \cup \epsilon)=\{\epsilon, 0,1,01\}$
- $1^{*} \emptyset=\emptyset$
- $\emptyset^{*}=\{\epsilon\}$
- $0 \Sigma^{*} 0 \cup 1 \Sigma^{*} 1 \cup 0 \cup 1=\{w \mid w$ starts and ends with the same symbol $\}$

Languages to Regular Expressions Examples
Consider languages over the alphabet $\{0,1,2\}$
(1) $L_{1}=\{w \mid w$ has 2 consecutive 0 's $\}$

(2) $L_{2}=\{w \mid w$ has a substring 101 and ends in 22 $\}$

$$
\Sigma^{*} 101 \Sigma^{B} 22
$$

(3) $L_{3}=\left\{w \mid w \in L_{1}\right.$ or $\left.w \in L_{2}\right\}$

$$
\left(R_{1}\right) \cup\left(R_{2}\right)
$$

$$
\begin{aligned}
& \left(\varepsilon^{*} 00 \varepsilon^{p}\right) \\
& v\left(\varepsilon^{*}|0| \varepsilon^{\prime \prime} L_{2}\right)
\end{aligned}
$$

Question:
What does this have to do with FAs and regular languages?

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(1) Lecture 4 Review
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(3) Regular Expressions $==$ Regular Languages

44 Properties of Regular Expressions

## Regular Expressions $==$ Regular Languages $==$ NFA

## Theorem

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(1) $R=a$ for some $a \in \Sigma$

(3) $R=\emptyset$
(9) $R=R_{1} \cup R_{2}$
(3) $R=R_{1} \circ R_{2}$
(-) $R=R_{1}^{*}$

(2) $R=\epsilon$


## An Example

Problem: Convert $(a b \cup a)^{*}$ to an NFA
In English: Either "ab" or "a" repeated 0 or more times

- a:
- $b$ :
ab:


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## Question

How do we represent $L$ by a regular expression?

## Step 1: NFA $\rightarrow$ generalized NFA

A generalized NFA has 3 important properties:
(1) Start state has no incoming edges
(2) Only one accept state, and it has no outgoing edges
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## Step 2: Node Elimination - Remove Node 1

Remove nodes one-by-one (in any order) until only start and accept states left:

- Need to update reg. exp.'s for all paths through removed nodes



## Step 2: Node Elimination - Remove Node 2

Remove nodes one-by-one (in any order) until only start and accept states left:

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## We are Done

Output label of final edge from start to accept state.


## Generalized Node Elimination



## Proof

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Base Case: For $|G|=2, G$ consists of start and accept states and arrow between them. The label on this arrow exactly describes the language of strings accepted by $G$.

## Proof

## Theorem

For any GNFA $G, G^{\prime}=\operatorname{NODE}-\operatorname{ELIMINATE}(G)$ is equivalent to $G$
Inductive step: Assume true for $|G|=k-1$, prove true for $|G|=k$. (i.e., prove that $G^{\prime}=G$ )

- Assume some $w$ s.t. $G(w)=1$, then on input $w, G$ goes through

$$
q_{\text {start }}, q_{1}, q_{2}, \ldots, q_{\text {accept }}
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- If $q_{r i p}$ is not on this path, clearly $G^{\prime}(w)=1$
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- If it would have gone through $q_{\text {rip }}$ then the modified edge accepts $w$, so there is a path through $q_{\text {rip }}$ in $G$ that accepts $w$.
- If the accepting path would not have gone through $q_{\text {rip }}$, then $G$ must also have the same path to accept $w$


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Proof:

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Proof:

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- Since we already showed how to build NFA to show closure, can convert that to regular expression to prove the claim.

