# CS 301 <br> Lecture 03 - Nondeterministic Finite Automata (NFAs) 

## Review from last time

DFAs are 5 -tuples $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$ where

- $Q$ is a finite set of states
- $\Sigma$ is an alphabet (finite, nonempty set of symbols)

- $\delta: Q \times \Sigma \rightarrow Q$ is the transition function
- $q_{0} \in Q$ is the start state
- $F \subseteq Q$ is the set of accepting states

A language $A$ is regular if it is recognized by some DFA $M$, i.e.,
$A=L(M)=\left\{w \in \Sigma^{*} \mid M\right.$ accepts $\left.w\right\}$

## Operations on languages

We can define operations on languages which are functions that map from one or more languages to a new language

Unary operations are functions that map one language to another

- Complement: $\bar{A}=\left\{w \in \Sigma^{*} \mid w \notin A\right\}$
- Reverse: $A^{\mathcal{R}}=\left\{w^{\mathcal{R}} \mid w \in A\right\}$
- Kleene star: $A^{*}=\left\{w_{1} w_{2} \cdots w_{k} \mid k \geq 0\right.$ and $w_{i} \in A$ for all $\left.i\right\}$
- $\operatorname{EndsWith}(A)=\left\{x w \mid x \in \Sigma^{*}\right.$ and $\left.w \in A\right\}$
- ...


## Operations on languages

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Binary operations are functions that map a pair of languages to a new language

- Union: $A \cup B$
- Intersection: $A \cap B$
- Concatenation: $A \circ B=\{x y \mid x \in A$ and $y \in B\}$


## Complement

## Theorem

If $A$ is a regular language, then $\bar{A}$ is a regular language.

General proof technique
(1) Start by assuming that $A$ is a regular language
(2) Since (by assumption) $A$ is regular, there is a DFA $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$ that recognizes $A$ (i.e., $L(M)=A$ )
(3) Construct a new DFA $M^{\prime}=\left(Q^{\prime}, \Sigma, \delta^{\prime}, q_{0}^{\prime}, F^{\prime}\right)$ that recognizes the language we want to show is regular
(4) Since the language is recognized by a DFA, it is regular

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Proof.
(1) Assume $A$ is a regular language recognized by DFA $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$

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## Proof.

(1) Assume $A$ is a regular language recognized by DFA $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$
(2) Construct a new DFA $M^{\prime}=\left(Q, \Sigma, \delta, q_{0}, F^{\prime}\right)$ that is identical to $M$ except that the accepting and nonaccepting states have been swapped.
That is, $F^{\prime}=Q \backslash F$.

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That is, $F^{\prime}=Q \backslash F$.
(3) If $M$ accepts $w$, then when $M$ is run on $w$, it ends in a state $q \in F$. Thus, when $M^{\prime}$ is run on $w$, it ends in state $q \notin Q \backslash F=F^{\prime}$ so $M^{\prime}$ rejects $w$.

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(4) If $M$ rejects $w$, then when $M$ is run on $w$, it ends in state $q \notin F$. Thus, when $M^{\prime}$ is run on $w$, it ends in state $q \in Q \backslash F=F^{\prime}$ so $M^{\prime}$ accepts $w$.

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(4) If $M$ rejects $w$, then when $M$ is run on $w$, it ends in state $q \notin F$. Thus, when $M^{\prime}$ is run on $w$, it ends in state $q \in Q \backslash F=F^{\prime}$ so $M^{\prime}$ accepts $w$.
(5) Therefore, $L\left(M^{\prime}\right)=\bar{A}$. Since DFA $M^{\prime}$ recognizes $\bar{A}, \bar{A}$ is regular.

## Complement example

Let $A=\{w \mid$ aba is a substring of $w\}$

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## Union

## Theorem

If $A$ and $B$ are regular languages, then $A \cup B$ is regular.
Proof.
(1) Assume DFA $M_{1}=\left(Q_{1}, \Sigma, \delta_{1}, q_{1}, F_{1}\right)$ recognizes $A$ and $M_{2}=\left(Q_{2}, \Sigma, \delta_{2}, q_{2}, F_{2}\right)$ recognizes $B$.

## Union

## Theorem

If $A$ and $B$ are regular languages, then $A \cup B$ is regular.
Proof.
(1) Assume DFA $M_{1}=\left(Q_{1}, \Sigma, \delta_{1}, q_{1}, F_{1}\right)$ recognizes $A$ and $M_{2}=\left(Q_{2}, \Sigma, \delta_{2}, q_{2}, F_{2}\right)$ recognizes $B$.
(2) Build a new DFA $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$ with states consisting of pairs of states from $M_{1}$ and $M_{2}$. Formally,

$$
\begin{aligned}
Q & =Q_{1} \times Q_{2} \\
q_{0} & =\left(q_{1}, q_{2}\right) \\
\delta((q, r), t) & =\left(\delta_{1}(q, t), \delta_{2}(r, t)\right) \\
F & =\left\{(q, r) \mid q \in F_{1} \text { or } r \in F_{2}\right\} .
\end{aligned}
$$

As $M$ transitions from state $(q, r)$ to state $\left(q^{\prime}, r^{\prime}\right)$, the first element changes according to $\delta_{1}$ and the second according to $\delta_{2}$.

## Union

(3) Consider running $M_{1}, M_{2}$, and $M$ on string $w$. The three DFAs end in states $q$, $r$, and ( $q, r$ ), respectively. If $w \in A$, then $M_{1}$ accepts $w$ so $q \in F_{1}$ and thus $(q, r) \in F$ so $M$ accepts $w$. Similarly, if $w \in B$, then $M_{2}$ accepts $w$ so $r \in F_{2}$ and thus $(q, r) \in F$. If $w$ is in neither $A$ nor $B$, then $q \notin F_{1}$ and $r \notin F_{2}$ so $(q, r) \notin F$.
(4) Therefore, $L(M)=A \cup B$ so $A \cup B$ is regular.

## Union example

Let $A=\{w \mid$ aba is not a substring of $w\}$ and $M_{1}$ recognize $A$
Let $B=\{w| | w \mid$ is even $\}$ and $M_{2}$ recognize $B$


## Union example

Let $A=\{w \mid$ aba is not a substring of $w\}$ and $M_{1}$ recognize $A$
Let $B=\{w| | w \mid$ is even $\}$ and $M_{2}$ recognize $B$

$M_{2}:$


M:


## Union example



M:

aabbaba

## Union example



aabbaba

## Union example



M:

aabbaba

## Union example



M:

aabbaba

## Union example



M:

aabbaba

## Union example



M:

aabbaba

## Union example



M:


## Union example



M:

aabbaba Rejected

## EndsWith

## $\operatorname{EndsWith}(A)=\left\{x w \mid x \in \Sigma^{*}\right.$ and $\left.w \in A\right\}$

- $A=\{\mathrm{a}, \mathrm{a} a \mathrm{~b}, \mathrm{bab}\} ; \operatorname{EndsWith}(A)=\{w \mid w$ ends with a, aab, or bab $\}$
- $B=\left\{\mathrm{b}^{k} \mid k>0\right\} ; \operatorname{EndsWith}(B)=\{w \mid w$ ends with 1 or more b$\}$
- $C=\left\{\mathrm{a}^{k}{ }^{k}{ }^{k} \mid k \geq 0\right\}$;
$\operatorname{EndsWith}(\mathrm{C})=\left\{w \mid w\right.$ ends with $\mathrm{a}^{k} \mathrm{~b}^{k}$ for some $\left.k \geq 0\right\}=\Sigma^{*}$ [Why?]


## A simple theorem

Theorem
If $A$ is regular, then $\operatorname{EndsWith}(A)=\left\{x w \mid x \in \Sigma^{*}\right.$ and $\left.w \in A\right\}$ is regular.
Proof technique
Start by assuming that $A$ is regular and thus there exists a DFA $M$ such that $L(M)=A$

Now construct a new DFA $M^{\prime}$ such that $L\left(M^{\prime}\right)=\operatorname{EndSWith}(A)$.
Ideally, this new DFA would have two parts:
(1) some states that read symbols from $\Sigma^{*}$ (i.e., matching the symbols of $x$ )
(2) a copy of $M$ to accept the last part of the string which should be in $A$

## A simple theorem proof difficulty

The two parts are individually easy
(1) Match symbols from $\Sigma^{*}$ (assume $\Sigma=\{\mathrm{a}, \mathrm{b}\}$, easy to generalize)

(2) A copy of $M$


But how can we combine them?


## Determinism

DFAs are deterministic because at every step, the DFA has exactly one thing it can do
When $M$ is in some state $q \in Q$ and the next input symbol is $t \in \Sigma$, the only thing it can do is move to state $\delta(q, t)$

Graphically, we don't allow any state to have multiple edges (transitions) labeled with the same symbol going to different states

Similarly, we don't allow a state to not have a transition labeled with a symbol of $\Sigma$

## Nondeterminism

Let's build a new type of machine, a nondeterministic finite automaton (NFA), where at each step, it has zero or more things it can do

Three new options
(1) Multiple transitions from a state on the same symbol


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(1) Multiple transitions from a state on the same symbol

(2) Transitions on no input


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Let's build a new type of machine, a nondeterministic finite automaton (NFA), where at each step, it has zero or more things it can do

Three new options
(1) Multiple transitions from a state on the same symbol

(2) Transitions on no input $\bigcirc \xrightarrow{\varepsilon} \bigcirc$


## Example



Let's run this on input ababb

## Example



Let's run this on input ababb
(1) Start in $q_{0}$, first symbol is a, two choices, let's stay in $q_{0}$

## Example



Let's run this on input ababb
(1) Start in $q_{0}$, first symbol is a, two choices, let's stay in $q_{0}$
(2) Next symbol is b, but there are no transitions labeled b

## Example



Let's run this on input ababb
(1) Start in $q_{0}$, first symbol is a, two choices, let's stay in $q_{0}$
(2) Next symbol is b, but there are no transitions labeled b
(3) Now the machine is dead because there's no active state

Since the machine didn't end in an accepting state. Is ababb Rejected?

## Example again



Let's run this on input ababb again

## Example again



Let's run this on input ababb again
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$

## Example again



Let's run this on input ababb again
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$

## Example again



Let's run this on input ababb again
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$
(3) Next symbol is a, go to $q_{3}$

## Example again



Let's run this on input ababb again
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$
(3) Next symbol is a, go to $q_{3}$
(4) We have two choices: follow the $\varepsilon$ transition or not, let's follow it

## Example again



Let's run this on input ababb again
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$
(3) Next symbol is a, go to $q_{3}$
(4) We have two choices: follow the $\varepsilon$ transition or not, let's follow it
(5) Next symbol is b, but there are no transitions labeled b

## Example again



Let's run this on input ababb again
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$
(3) Next symbol is a, go to $q_{3}$
(4) We have two choices: follow the $\varepsilon$ transition or not, let's follow it
(5) Next symbol is b, but there are no transitions labeled b
(6) Now the machine is dead because there's no active state

Once again, it didn't end in an accepting state.

## Example yet again



Let's run this on input ababb a third time

## Example yet again



Let's run this on input ababb a third time
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$

## Example yet again



Let's run this on input ababb a third time
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$

## Example yet again



Let's run this on input ababb a third time
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$
(3) Next symbol is a, go to $q_{3}$

## Example yet again



Let's run this on input ababb a third time
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$
(3) Next symbol is a, go to $q_{3}$
(4) We have two choices: follow the $\varepsilon$ transition or not, let's not follow it

## Example yet again



Let's run this on input ababb a third time
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$
(3) Next symbol is a, go to $q_{3}$
(4) We have two choices: follow the $\varepsilon$ transition or not, let's not follow it
(5) Next symbol is b, go to $q_{4}$

## Example yet again



Let's run this on input ababb a third time
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$
(3) Next symbol is a, go to $q_{3}$
(4) We have two choices: follow the $\varepsilon$ transition or not, let's not follow it

5 Next symbol is b, go to $q_{4}$
(6) Next symbol is b, go to $q_{5}$

## Example yet again



Let's run this on input ababb a third time
(1) Start in $q_{0}$, first symbol is a, two choices, let's go to $q_{1}$
(2) Next symbol is b, go to $q_{2}$
(3) Next symbol is a, go to $q_{3}$
(4) We have two choices: follow the $\varepsilon$ transition or not, let's not follow it

5 Next symbol is b, go to $q_{4}$
(6) Next symbol is b, go to $q_{5}$
(7) There's no more input and the machine ended in an accepting state so ababb is $\checkmark$ Accepted

## Was ababb accepted or rejected?

Two choices we made led to the machine dying because it couldn't follow a transition
The third choice we made ended in an accepting state
Let's say an NFA accepts a string if any path through the NFA ends in an accepting state

So ababb was $\sqrt{ }$ Accepted

## Language of the NFA

What strings are accepted by this NFA?


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Strings starting with at least 1 a , followed by ba, optionally followed by bb, followed by any number of as: $\left\{\mathrm{a}^{m} \mathrm{ba} w a^{n} \mid m \geq 1\right.$ and $n \geq 0$ and $\left.w \in\{\varepsilon, \mathrm{bb}\}\right\}$

## Running NFAs

It was a pain to run the NFA multiple times on the same input, making difference choices

Let's instead keep track of all possible states the NFA $N$ can be in at each point in its computation

Rather than having a single current state, let's have a set of current states, call it $C$
At each step, we're going to update $C$

## Procedure for running NFAs

## Procedure

(1) Set $C=\left\{q_{0}\right\}$, the set containing only the start state
(2) Set $C=\{q \mid q$ is reachable from $C$ by following 0 or more $\varepsilon$-transitions $\}$
(3) For each successive symbol $t$ in the input $w$,
(4) Set $C=\{q \mid$ there is a transition to $q$ on symbol $t$ from some state in $C\}$
(5) Set $C=\{q \mid q$ is reachable from $C$ by following 0 or more $\varepsilon$-transitions $\}$
(6) If $C$ contains any accepting states, $N$ accepts $w$, otherwise $N$ rejects $w$

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ababb

## Running our NFAs

## Procedure

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ababb $\sqrt{ }$ Accepted

## Nondeterministic finite automaton (NFA)

A nondeterministic finite automaton (NFA) is a 5-tuple $N=\left(Q, \Sigma, \delta, q_{0}, F\right)$ where

- $Q$ is a finite set of states
- $\Sigma$ is an alphabet
- $\delta: Q \times \Sigma_{\varepsilon} \rightarrow P(Q)$ is the transition function
- $q_{0} \in Q$ is the start state
- $F \subseteq Q$ is the set of accepting (or final) states
$\Sigma_{\varepsilon}=\Sigma \cup\{\varepsilon\}$ is the alphabet $\Sigma$ augmented with an additional symbol $\varepsilon$ which we use to denote transitions on no input
$P(Q)$ is the power set of $Q$ so $\delta$ returns a set of next states


## Transition functions

DFAs have transitions of the form $\delta: Q \times \Sigma \rightarrow Q$ For each (state, symbol) pair, $\delta$ returns a single state

NFAs have transitions of the form $\delta: Q \times \Sigma_{\varepsilon} \rightarrow P(Q)$
For each (state, symbol) pair, $\delta$ returns 0 or more states For each (state, $\varepsilon$ ), $\delta$ returns 0 or more states

## Formalizing NFA computation

Let $N=\left(Q, \Sigma, \delta, q_{0}, F\right)$ be an NFA and let $w=w_{1} w_{2} \cdots w_{n}$ be a string where $w_{i} \in \Sigma_{\varepsilon}$
$N$ accepts $w$ if there exist states $r_{0}, r_{1}, \ldots, r_{n} \in Q$ such that
(1) $r_{0}=q_{0}$
[The NFA starts in the start state]
(2) $r_{i} \in \delta\left(r_{i-1}, w_{i}\right)$ for $i \in\{1,2, \ldots, n\}$
[The NFA moves from state $r_{i-1}$ to one of the possible next states according to $\delta$ ]
(3) $r_{n} \in F$
[The NFA ends in an accepting state]

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[The NFA moves from state $r_{i-1}$ to one of the possible next states according to $\delta$ ]
(3) $r_{n} \in F$
[The NFA ends in an accepting state]

Two key differences from DFAs
(1) $w_{i}$ is either an alphabet symbol or $\varepsilon$
E.g., if $w=$ abaa, then we can write $w=\varepsilon \operatorname{ab} \varepsilon \varepsilon \varepsilon \mathrm{a} \varepsilon \mathrm{a}$
(2) $r_{i} \in \delta\left(r_{i-1}, w_{i}\right)$ since $\delta$ returns a set of next possible states

The sequence of $n+1$ states $r_{0}, r_{1}, \ldots, r_{n}$ is one of the possible sequences of states that the NFA moves through on input $w$

## Language of an NFA

The language of an NFA $N$ is $L(N)=\{w \mid N$ accepts $w\}$
We say $N$ recognizes a language $A$ to mean $L(N)=A$
[This is analogous to DFAs]

## Example



## Example



$$
N=\left(Q, \Sigma, \delta, q_{0}, F\right) \text { where }
$$

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

$$
\Sigma=\{\mathrm{a}, \mathrm{~b}\}
$$

$$
F=\{1,2\}
$$

$\delta:$|  | a | b | $\varepsilon$ |
| :---: | :---: | :---: | :---: |
| 1 | $\varnothing$ | $\{2\}$ | $\{3\}$ |
| 2 | $\{2,3\}$ | $\{3\}$ | $\varnothing$ |
| 3 | $\{1\}$ | $\varnothing$ | $\varnothing$ |

Consider string $w=$ abaa
Write $w$ as $\varepsilon$ abaa then one of the possible sequences of states $N$ moves through is

$$
\begin{array}{cccccc}
r_{0} & r_{1} & r_{2} & r_{3} & r_{4} & r_{5}
\end{array}
$$

$$
q_{0}=1
$$

## Example



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N=\left(Q, \Sigma, \delta, q_{0}, F\right) \text { where }
$$

| $r_{0}$ | $r_{1}$ | $r_{2}$ | $r_{3}$ | $r_{4}$ | $r_{5}$ |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 3 | 1 |  |  |  |

$Q=\{1,2,3\}$
$\Sigma=\{\mathrm{a}, \mathrm{b}\}$
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## Example



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\begin{aligned}
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& Q=\{1,2,3\} \\
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& \delta:
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r_{0} & r_{1} & r_{2} & r_{3} & r_{4} & r_{5} \\
1 & 3 & 1 & 2 & 3 & 1
\end{array}
$$

All three conditions for acceptance hold
(1) $r_{0}=q_{0}$
(2) $r_{i} \in \delta\left(r_{i-1}, w_{i}\right)$ for $i \in\{1,2, \ldots, n\}$
(3) $r_{n} \in F$

## Converting NFAs to DFAs

Theorem
For every NFA $N$, there exists a DFA $M$ such that $L(M)=L(N)$.

We can prove this by following our procedure for running NFAs

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## Some helpful notation

Given an NFA $N=\left(Q, \Sigma, \delta, q_{0}, F\right)$, define a new function $E$ that takes a set of states $S \subseteq Q$ as input and returns the set of states reachable by following 0 or more $\varepsilon$-transitions from states in $S$

Formally, $E: P(Q) \rightarrow P(Q)$ given by
$E(S)=\{q \mid q$ is reachable from some $r \in S$ by following 0 or more $\varepsilon$-transitions $\}$
$E(S)$ is called the $\varepsilon$-closure of $S$

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Procedure (ver. 2)
(1) Set $C=E\left(\left\{q_{0}\right\}\right)$
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## Running the procedure again

Procedure (ver. 2)
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## Converting an NFA to a DFA

Procedure (ver. 2)
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Given an NFA $N=\left(Q, \Sigma, \delta, q_{0}, F\right)$, we can convert our procedure into a DFA $M=\left(Q^{\prime}, \Sigma, \delta^{\prime}, q_{0}^{\prime}, F^{\prime}\right)$

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- States in $M$ are sets of states in $N: Q^{\prime}=P(Q)$


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- $M$ 's start state is $q_{0}^{\prime}=E\left(\left\{q_{0}\right\}\right)$


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- $M$ 's start state is $q_{0}^{\prime}=E\left(\left\{q_{0}\right\}\right)$
- M's transition function $\delta^{\prime}: P(Q) \times \Sigma \rightarrow P(Q)$ is $\delta^{\prime}(C, t)=\{q \mid q \in E(\delta(r, t))$ for some $r \in C\}$


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- $M$ 's accepting states are every subset of $Q$ that contains at least one of $N$ 's accepting states: $F^{\prime}=\{S \mid S \subseteq Q$ and $S \cap F \neq \varnothing\}$


## Converting our example to a DFA



UIC

## Converting our example to a DFA



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UIC

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UIC

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abaababb

M:


UIC

## Converting our example to a DFA


abaababb $\boldsymbol{K}_{\text {Rejected }}$
$M$ :


UIC

## Regular languages

## Theorem

A language $A$ is regular if and only if it is recognized by some NFA $N$.

## Proof.

$\qquad$
If $A$ is regular, then it is recognized by a DFA $M$. DFAs are NFAs where each state has exactly one next state for each alphabet symbol so $M$ is an NFA.

If NFA $N$ recognizes $A$, then using the NFA to DFA construction, we can build an DFA $M$ such that $L(M)=A$. Therefore, $A$ is regular.

## Regular languages closed under operations

Let $f$ be an operation on languages
[Recall that means $f$ takes some languages as input and produces a new language as output]

We say regular languages are closed under $f$ to mean
Unary If $A$ is regular, then $f(A)$ is regular
Binary If $A$ and $B$ are regular, then $f(A, B)$ is regular
$n$-ary If $A_{1}, A_{2}, \ldots, A_{n}$ are regular, then $f\left(A_{1}, A_{2}, \ldots, A_{n}\right)$ is regular

## Regular languages are closed under regular operations

Regular operations
Union $A \cup B=\{w \mid w \in A$ or $w \in B\}$
Concatenation $A \circ B=\{x y \mid x \in A$ and $y \in B\}$
Kleene star $A^{*}=\left\{w_{1} w_{2} \cdots w_{k} \mid k \geq 0\right.$ and $w_{i} \in A$ for all $\left.i\right\}$

## Theorem

Regular languages are closed under union, concatenation, and Kleene star.

In other words, if $A$ and $B$ are regular languages, then $A \cup B, A \circ B$, and $A^{*}$ are regular.

## Union

Let $A$ and $B$ be regular languages recognized by DFAs $M_{1}$ and $M_{2}$


## Regular languages are closed under union

Proof.
Let $A$ and $B$ be regular languages recognized by DFAs

$$
\begin{aligned}
& M_{1}=\left(Q_{1}, \Sigma, \delta, q_{1}, F_{1}\right) \\
& M_{2}=\left(Q_{2}, \Sigma, \delta, q_{2}, F_{2}\right) .
\end{aligned}
$$

Build NFA $N=\left(Q, \Sigma, \delta, q_{0}, F\right)$ where

$$
\begin{aligned}
Q & =Q_{1} \cup Q_{2} \cup\left\{q_{0}\right\} \\
F & =F_{1} \cup F_{2} \\
\delta(q, \varepsilon) & = \begin{cases}\left\{q_{1}, q_{2}\right\} & \text { if } q=q_{0} \\
\varnothing & \text { otherwise }\end{cases} \\
\delta(q, t) & = \begin{cases}\varnothing & \text { if } q=q_{0} \\
\left\{\delta_{1}(q, t)\right\} & \text { for } q \in Q_{1} \\
\left\{\delta_{2}(q, t)\right\} & \text { for } q \in Q_{2}\end{cases}
\end{aligned}
$$



## Concatenation

Let $A$ and $B$ be regular languages recognized by DFAs $M_{1}$ and $M_{2}$


## Concatenation

Let $A$ and $B$ be regular languages recognized by DFAs $M_{1}$ and $M_{2}$

$\Downarrow$


Let

$$
\begin{aligned}
& M_{1}=\left(Q_{1}, \Sigma, \delta, q_{1}, F_{1}\right) \\
& M_{2}=\left(Q_{2}, \Sigma, \delta, q_{2}, F_{2}\right) .
\end{aligned}
$$

Build NFA $N=\left(Q, \Sigma, \delta, q_{1}, F_{2}\right)$ where

$$
\begin{aligned}
Q & =Q_{1} \cup Q_{2} \\
\delta(q, \varepsilon) & = \begin{cases}\left\{q_{2}\right\} & \text { if } q \in F_{1} \\
\varnothing & \text { otherwise }\end{cases} \\
\delta(q, t) & = \begin{cases}\left\{\delta_{1}(q, t)\right\} & \text { for } q \in Q_{1} \\
\left\{\delta_{2}(q, t)\right\} & \text { for } q \in Q_{2} .\end{cases}
\end{aligned}
$$

## Kleene Star

Let $A$ be a regular language recognized by DFA $M_{1}$

$\Downarrow$


## Kleene Star

Let $A$ be a regular language recognized by DFA $M_{1}$


Let $M_{1}=\left(Q_{1}, \Sigma, \delta, q_{1}, F_{1}\right)$.
Build NFA $N=\left(Q, \Sigma, \delta, q_{0}, F\right)$ where

$$
\begin{aligned}
Q & =Q_{1} \cup\left\{q_{0}\right\} \\
F & =F_{1} \cup\left\{q_{0}\right\} \\
\delta(q, \varepsilon) & = \begin{cases}\left\{q_{1}\right\} & \text { if } q \in F \\
\varnothing & \text { otherwise }\end{cases} \\
\delta(q, t) & = \begin{cases}\varnothing & \text { if } q=q_{0} \\
\left\{\delta_{1}(q, t)\right\} & \text { for } q \in Q_{1}\end{cases}
\end{aligned}
$$

## Let's build some NFAs!

- $A=\{w \mid w$ starts with a and ends with b$\}$
- $B=\varnothing$
- $C=\{\varepsilon\}$
- $D=\{w \mid w$ has an even number of as or exactly 2 bs$\}$
- $E=\{\mathrm{aa}, \mathrm{aba}, \mathrm{bab}, \mathrm{bbb}\}$

