# Nondeterministic Finite Automata and Regular Expressions 

CS 2800: Discrete Structures, Spring 2015

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## Recap: Deterministic Finite Automaton

- A DFA is a 5 -tuple $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$
- $Q$ is a finite set of states
- $\Sigma$ is a finite input alphabet (e.g. $\{0,1\}$ )
- $\delta$ is a transition function $\delta: Q \times \Sigma \rightarrow Q$
- $q_{0} \in Q$ is the start/initial state
- $F \subseteq Q$ is the set of final/accepting states




## $P=N P!!!$




A NON-deterministic finite automaton lets you try all possible choices in parallel. If ANY choice leads you to the treasure, the pirate can't harm you!


## A non-deterministic finite automaton



## A non-deterministic finite automaton



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An NFA accepts a string $x$ if it can get to an accepting state on input $x$

## A non-deterministic finite automaton



What language does this automaton accept?

## A non-deterministic finite automaton



Answer: All strings ending with 1

## Another NFA



What language does this automaton accept?

## Another NFA



Answer: All strings with 1 in the penultimate place

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- A convenient shortcut for our "hell/black-hole" state
- Class convention: Draw all possible transitions for DFA. Not required for NFA (missing transitions lead to hell).


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$f\left(\right.$ state $_{1}$, symbol $) \mapsto$ state $_{2}$ with $f\left(\right.$ state $_{1}$, symbol $) \mapsto\left\{\right.$ state $\left._{2}\right\}$


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- Every NFA can be simulated by a DFA
- ... i.e. they accept exactly the same language
- Exponential blowup: if the NFA has $n$ states, the DFA can require up to $2^{n}$ states


## Thought for the Day \#1

Find an NFA with $n$ states that can't be simulated by a DFA with less than $2^{n}$ states

## Every NFA can be simulated by a DFA

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NFA
(fragment)

## Every NFA can be simulated by a DFA



NFA
(fragment)
DFA (fragment)


## Every NFA can be simulated by a DFA


"Subset construction" Main idea: ONE state of DFA tracks current states of ALL evolving paths of NFA
(fragment)

## DFA (fragment)


(This is merely illustrative - formal construction on following slides)

## Every NFA can be simulated by a DFA

NFA

Equivalent DFA

Specification

States

Alphabet

Transition Function

Initial State

Accepting States

## Every NFA can be simulated by a DFA

## NFA

Specification
$\left(Q, \Sigma, \delta, q_{0}, F\right)$
$\left(2^{Q}, \Sigma, \delta^{\prime}, q_{0}^{\prime}, F^{\prime}\right)$

States

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$Q$
$2^{Q}$

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Alphabet
$Q$
$\Sigma$
$\Sigma$

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States

Alphabet

Transition Function
$\delta$

$$
\delta^{\prime}(S, a)=\bigcup_{s \in S} \delta(s, a)
$$

Initial State

Accepting States

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$q_{0}$

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q_{0}^{\prime}=\left\{q_{0}\right\}
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Accepting States

## Every NFA can be simulated by a DFA

## NFA

Specification

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Equivalent DFA

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Transition Function
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Initial State
$q_{0}$

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Accepting States
F
$F^{\prime}=\left\{S \in 2^{Q} \mid S \cap F \neq \varnothing\right\}$

Why NFAs?

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- They can be way more compact than DFAs


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NFA


Equivalent minimal DFA

- It's easier to directly convert regular expressions ("wildcard search" on steroids) to NFAs



## Playing with regexes

- http://regex101.com/
- http://rubular.com/
- http://www.google.com/search?q=online+regex+tester


# Regular expressions ("regex"-es) are defined by structural induction 

(start with simple base expressions, construct more complicated ones recursively)

## Empty set

$$
L(\varnothing)=\varnothing
$$

## Empty string

$$
L(\boldsymbol{\varepsilon})=\{\varepsilon\}
$$

## Literal character

$$
L(\mathbf{x})=\{x\}
$$

$$
\text { e.g. } L(\mathbf{1})=\{1\}, L(\mathbf{2})=\{2\}, L(\mathbf{a})=\{a\}
$$

## Concatenation

$$
L(A B)=\{a b \mid a \in L(A), \mathrm{b} \in L(B)\}
$$

$$
\text { e.g. } L(\mathbf{1 2})=\{12\}, L(\mathbf{a a b b})=\{a a b b\}
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## Alternation

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L(A \mid B)=L(A) \cup L(B)
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\text { e.g. } L(\mathbf{1} \mid \mathbf{2})=\{1,2\}, L(\mathbf{a a} \mid \mathbf{b} \mathbf{b})=\{a a, b b\}
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\begin{gathered}
L\left(A^{*}\right)= \\
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