# Finite Automata Part Two

#### Recap from Last Time

#### **DFAS**

- A **DFA** is a **Deterministic** Finite
- Automaton

DFAs are the simplest type of automaton that we will see in this course.

## DFAs

A DFA is defined relative to some alphabet Σ.

- For each state in the DFA, there must be *exactly one* transition defined for each symbol in Σ.
- This is the "deterministic" part of DFA.
- There is a unique start state.
- There are zero or more accepting states.

A language *L* is called a *regular language* if there exists a DFA *D* such that  $\mathscr{L}(D) = L$ .

## **NFAS**

- An NFA is a **Nondeterministic** Finite
- Automaton

Can have missing transitions or multiple transitions defined on the same input symbol.

Accepts if any possible series of choices leads to an accepting state.





























































#### NFA Languages



The *language of an NFA* is  $\mathscr{L}(N) = \{ w \in \Sigma^* | N \text{ accepts } w \}.$ What is the language of this NFA?  $(Assume \Sigma = \{h, i\}).$ 

#### NFA Languages





NFAs have a special type of transition called the **ε-transition**.

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An NFA may follow any number of ε-transitions at any time without consuming any input.

**b a a b b**



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**E-Transitions**<br>special type of transitions<br>follow any number of a<br>out consuming any in<br> $\frac{a}{q_1}$ An NFA may follow any number of ε-transitions at any time without consuming any input.





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#### ε-Transitions

NFAs have a special type of transition called the **ε-transition**.

An NFA may follow any number of ε-transitions at any time without consuming any input.

NFAs are not *required* to follow ε-transitions. It's simply another option at the machine's disposal.

## Intuiting Nondeterminism

Nondeterministic machines are a serious departure from physical computers. How can we build up an intuition for them?

There are two particularly useful frameworks for interpreting nondeterminism:

*Perfect positive guessing Massive parallelism*















#### $q_0$   $q_1$   $\rightarrow$   $q_2$   $\rightarrow$   $q_3$ Perfect Positive Guessing *q* start  $\begin{pmatrix} 1 & a & b \\ q_0 & q_1 & a \end{pmatrix}$  b  $\begin{pmatrix} 1 & a_2 & a_3 \end{pmatrix}$ Σ a





























We can view nondeterministic machines as having *Magic Superpowers* that enable them to quess choices that lead to an accepting state.

If there is at least one choice that leads to an accepting state, the machine will guess it. If there are no choices, the machine quesses any one of the wrong guesses.

There is no known way to physically model this intuition of nondeterminism – this is quite a departure from reality!




























































































































We're in at least one accepting state, so there's some path that gets us to an accepting state.







































































































We're not in any accepting state, so no possible path accepts.




# Massive Parallelism

An NFA can be thought of as a DFA that can be in many states at once.

At each point in time, when the NFA needs to follow a transition, it tries all the options at the same time.

(Here's a rigorous explanation about how this works; read this on your own time).

Start off in the set of all states formed by taking the start state and including each state that can be reached by zero or more εtransitions.

When you read a symbol **a** in a set of states *S*:

Form the set *S'* of states that can be reached by following a single **a** transition from some state in *S*.

Your new set of states is the set of states in *S'*, plus the states reachable from *S'* by following zero or more ε-transitions.

# So What?

Each intuition of nondeterminism is useful in a different setting:

Perfect guessing is a great way to think about how to design a machine.

Massive parallelism is a great way to test machines – and has nice theoretical implications.

Nondeterministic machines may not be feasible, but they give a great basis for interesting questions:

Can any problem that can be solved by a nondeterministic machine be solved by a deterministic machine?

Can any problem that can be solved by a nondeterministic machine be solved *efficiently* by a deterministic machine?

The answers vary from automaton to automaton.

# Designing NFAs

# Designing NFAs

#### *Embrace the nondeterminism!*

#### Good model: *Guess-and-check*:

Is there some information that you'd really like to have? Have the machine  $\check{}\;$ *nondeterministically guess* that information.

Then, have the machine *deterministically check* that the choice was correct.

The *guess* phase corresponds to trying lots of different options.

The *check* phase corresponds to filtering out bad guesses or wrong options.



























 $L = \{ w \in \{a, b, c\}^* \mid \text{at least one of } a, b, \text{ or } c \text{ is not in } w \}$ 



Nondeterministically *guess* which character is missing.

Deterministically *check* whether that character is indeed missing.

















# Time out for Announcements

# Midterm and Pset

- Congratulations on finishing the midterm!
- We'll have this returned to you on Monday.
- Problem Set 4 is due next Thursday.

#### Just how powerful are NFAs?

# NFAs and DFAs

Any language that can be accepted by a DFA can be accepted by an NFA.

Why?

Every DFA essentially already *is* an NFA!

**Question**: Can any language accepted by an NFA also be accepted by a DFA?

Surprisingly, the answer is *yes*!

#### Tabular DFAs





#### Tabular DFAs





### Tabular DFAs








## Tabular DFAs





**Question to ponder:** Why isn't there a column here for Σ?

# My Turn to Code Things Up!

**int** kTransitionTable[kNumStates][kNumSymbols] = {

{0, 0, 1, 3, 7, 1, …},

#### };

```
bool kAcceptTable[kNumStates] = {
```
**false**,

…

**true**,

**true**,

…

#### };

```
bool SimulateDFA(string input) {
```
**int** state = 0;

```
for (char ch: input) {
```

```
state = kTransitionTable[state][ch];
```
#### }

}

```
return kAcceptTable[state];
```
## *Thought Experiment:*

### How would you simulate an NFA in software?



























































































$$
\frac{\text{start}}{q_0} \left( \frac{a}{q_1} \right) \xrightarrow{b} \left( \frac{a}{q_2} \right) \xrightarrow{a} \left( \frac{a}{q_3} \right)
$$



 $\begin{pmatrix} a_0 \\ q_1 \end{pmatrix}$  a  $\begin{pmatrix} a_1 \\ a_2 \end{pmatrix}$  b  $\begin{pmatrix} a_2 \\ a_1 \end{pmatrix}$  $\frac{a}{\sqrt{a}}$ start  $q_3$ 



 $\frac{a}{q_1}$   $\left(\begin{array}{c} 0 \end{array}\right)$   $\frac{b}{q_2}$  $q_0$ start  $\mathbf{a}$  $q_3$ 



start  

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(q_0)
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 a  
 $(q_1)$  b  
 $(q_2)$  a  
 $(q_3)$ 



$$
\frac{\text{start}}{q_0} \left( \frac{1}{q_1} \right) \left( \frac{1}{q_2} \right) \left( \frac{1}{q_3} \right)
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start  

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 $(q_1)$  b  
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\frac{\text{Start}}{(q_0)} \stackrel{a}{\longrightarrow} \frac{1}{(q_1)} \stackrel{b}{\longrightarrow} \frac{1}{(q_2)} \stackrel{a}{\longrightarrow} \frac{1}{(q_3)}
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\frac{\text{start}}{q_0} \left( \frac{1}{q_1} \right) \left( \frac{1}{q_2} \right) \left( \frac{1}{q_3} \right)
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\frac{\text{start}}{q_0} \left( \frac{a}{q_1} \right)^{\frac{1}{2}} \left( \frac{a}{q_2} \right)^{\frac{1}{2}} \left( \frac{a}{q_3} \right)
$$











 $q_0$   $\frac{d}{d}$  *d*  $q_1$   $\frac{d}{d}$  *d*  $q_2$   $\frac{d}{d}$  *d*  $q_3$  $a \rightarrow a$  b  $a \rightarrow a$ Σ start



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start  

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(q_0)
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 a  
 $(q_1)$  b  
 $(q_2)$  a  
 $(q_3)$ 



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\begin{array}{|c|c|c|c|c|c|c|}\n\hline\n a & b & a & b & a\n\end{array}
$$



$$
\frac{\text{start}}{q_0} \left( \frac{1}{q_1} \right) \left( \frac{1}{q_2} \right) \left( \frac{1}{q_3} \right)
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\begin{array}{|c|c|c|c|c|c|c|}\n\hline\n a & b & a & b & a\n\end{array}
$$







































$$
\frac{\text{start}}{q_0} \left( \frac{a}{q_1} \right) \left( \frac{b}{q_2} \right) \left( \frac{a}{q_3} \right)
$$

$$
\begin{array}{|c|c|c|c|c|c|c|}\n\hline\n a & b & a\n\end{array}
$$



#### Some Caveats

*Question*: what about ε-transitions?

Answer: always include any states you can reach by following ε-transitions.

*Question*: what happens if there are *no*  transitions to follow from a set of states for the character you're trying to fill in?

Answer: then the set of states you can reach is the empty set!

Example included in the appendix of this lecture showing this construction with both of these scenarios.

# The Subset Construction

- This construction for transforming an NFA into a DFA is called the *subset construction* (or sometimes the *powerset construction*).
- Each state in the DFA is associated with a set of states in the NFA.
- The start state in the DFA corresponds to the start state of the NFA, plus all states reachable via ε-transitions.
- If a state *q* in the DFA corresponds to a set of states *S* in the NFA, then the transition from state *q* on a character a is found as follows:
- Let *S'* be the set of states in the NFA that can be reached by following a transition labeled a from any of the states in *S*. *(This set may be empty.)*
- Let *S*" be the set of states in the NFA reachable from some state in *S'* by following zero or more epsilon transitions.
- The state *q* in the DFA transitions on a to a DFA state corresponding to the set of states *S''*.
- *Read Sipser for a formal account.*

#### The Subset Construction

For the purposes of this class, we won't ask you to actually perform the subset construction.

Hopefully though, you've been convinced that, in principle, you *could* follow this procedure to turn any NFA into a DFA.

#### The Subset Construction

In converting an NFA to a DFA, the DFA's states correspond to sets of NFA states.

Useful fact:  $|\wp(S)| = 2^{|S|}$  for any finite set *S*.

In the worst-case, the construction can result in a DFA that is *exponentially larger* than the original NFA.

*Question to ponder:* Can you find a family of languages that have NFAs of size *n*, but no DFAs of size less than 2 *n*?

A language *L* is called a *regular language* if there exists a DFA *D* such that  $\mathscr{L}(D) = L$ .

#### *Theorem:* A language *L* is regular iff there is some NFA *N* such that  $\mathscr{L}(N) = L$ .

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If *L* is accepted by some NFA, we can use the subset construction to convert it into a DFA that accepts the same language, so *L* is regular.

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If *L* is accepted by some NFA, we can use the subset construction to convert it into a DFA that accepts the same language, so *L* is regular.

# Why This Matters

- We now have two perspectives on regular languages:
- Regular languages are languages accepted by DFAs.
- Regular languages are languages accepted by NFAs.
- We can now reason about the regular languages in two different ways.

#### Properties of Regular Languages

Given a language *L* ⊆ Σ\*, the *complement* of that language (denoted  $L$ ) is the language of all strings in Σ\* that aren't in *L*.

$$
\overline{L} = \Sigma^* - L
$$

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$$
\overline{L} = \Sigma^* - L
$$
  
\n**Good proofwriting exercise:**  
\n
$$
Prove \overline{L} = L \text{ for any language } L.
$$
  
\n
$$
\Sigma^*
$$

#### Complementing Regular Languages

 $L = \{ w \in \{a, b\}^* \mid w \text{ contains aa as a substring } \}$ 



 $\overline{L} = \{ w \in \{a, b\}^* \mid w \text{ does not contain aa as a substring } \}$ 


#### Complementing Regular Languages

*L* = { *w* ∈ {**a**, **\*** , **/**}\* | *w doesn't* represent a C-style comment }



#### Complementing Regular Languages

*L* = { *w* ∈ {**a**, **\*** , **/**}\* | *w doesn't* represent a C-style comment }



# Closure Properties

**Theorem:** If *L* is a regular language, then *L* is also a regular language.

As a result, we say that the regular languages are *closed under complementation*.



If  $L_1$  and  $L_2$  are languages over the alphabet Σ, the language  $L_1^- \cup L_2^-$  is the language of all strings in at least one of the two languages.

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If  $L_1$  and  $L_2$  are languages over Σ, then  $L_1 \cap L_2$  is the language of strings in both  $L^{}_1$  and  $L^{}_2.$ 

Question: If  $L_1$  and  $L_2$  are regular, is  $L_1 \cap L_2$  regular as well?

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 $L_1$   $L_2$ 

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 $L^{}_1 \cup L^{}_2$ 

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Question: If  $L_1$  and  $L_2$  are regular, is  $L_1 \cap L_2$  regular as well?



#### Concatenation

# String Concatenation

If  $w \in \Sigma^*$  and  $x \in \Sigma^*$ , the *concatenation* of w and x, denoted *wx*, is the string formed by tacking all the characters of *x* onto the end of *w*.

Example: if  $w =$  quo and  $x =$  kka, the concatenation  $wx =$  **quokka**.

Analogous to the  $+$  operator for strings in many programming languages.

Some facts about concatenation:

The empty string ε is the *identity element* for concatenation:

*w***ε = ε***w* **=** *w*

Concatenation is *associative*:

 $wxy = w(xy) = (wx)y$ 

## Concatenation

The *concatenation* of two languages  $L_1$  and  $L_2$  over the alphabet  $\Sigma$  is the language

 $L_1L_2 = \{ wx \in \Sigma^* \mid w \in L_1 \land x \in L_2 \}$ 

## Concatenation Example

Let  $\Sigma = \{a, b, ..., z, A, B, ..., Z\}$  and consider these languages over Σ:

 $\boldsymbol{Noun} = \{ \text{ Puppy}, \text{Rainbow}, \text{Whole}, \dots \}$ 

 $Verb = \{ Hugs, Juggles, Loves, ... \}$ 

*The* = { **The** }

The language *TheNounVerbTheNoun* is

{ **ThePuppyHugsTheWhale**, **TheWhaleLovesTheRainbow**, **TheRainbowJugglesTheRainbow**, … }

# Concatenation

The *concatenation* of two languages  $L_1$  and  $L_2$ over the alphabet  $\Sigma$  is the language

 $L_1L_2 = \{ wx \in \Sigma^* \mid w \in L_1 \land x \in L_2 \}$ 

Two views of  $L_1L_2$ :

The set of all strings that can be made by  $\,$ concatenating a string in *L*₁ with a string in *L*₂.

The set of strings that can be split into two pieces: a piece from *L*₁ and a piece from *L*₂.

If  $L^{}_1$  and  $L^{}_2$  are regular languages, is  $L^{}_1 L^{}_2?$ Intuition – can we split a string *w* into two strings *xy* such that  $x \in L_1$  and  $y \in L_2$ ?

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*Idea*:



 $M$ cohing for *L* If the automaton for *L*<sup>2</sup>



Machine for  $L<sub>2</sub>$ Machine for  $L_1$  Machine for  $L_2$ 

If  $L^{}_1$  and  $L^{}_2$  are regular languages, is  $L^{}_1 L^{}_2?$ Intuition – can we split a string *w* into two strings *xy* such that  $x \in L_1$  and  $y \in L_2$ ?



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If  $L^{}_1$  and  $L^{}_2$  are regular languages, is  $L^{}_1 L^{}_2?$ 

Intuition – can we split a string *w* into two strings *xy* such that  $x \in L_1$  and  $y \in L_2$ ?

#### *Idea*:

Run a DFA/NFA for  $L_1$  on  $w$ .

Whenever it reaches an accepting state, optionally hand the rest of  $w$  to a DFA/NFA for  $L_2$ .

If the automaton for  $L_2$  accepts the rest,  $w \in L_1L_2$ .

If the automaton for  $L_2$  rejects the remainder, the split was incorrect.







Machine for  $L<sub>2</sub>$ 







# Lots and Lots of Concatenation

Consider the language  $L = \{aa, b\}$ 

*LL* is the set of strings formed by concatenating pairs of strings in *L*.

#### { **aaaa**, **aab**, **baa**, **bb** }

*LLL* is the set of strings formed by concatenating triples of strings in *L*.

{ **aaaaaa**, **aaaab**, **aabaa**, **aabb**, **baaaa**, **baab**, **bbaa**, **bbb**}

*LLLL* is the set of strings formed by concatenating quadruples of strings in *L*.

> { **aaaaaaaa**, **aaaaaab**, **aaaabaa**, **aaaabb**, **aabaaaa**, **aabaab**, **aabbaa**, **aabbb**, **baaaaaa**, **baaaab**, **baabaa**, **baabb**, **bbaaaa**, **bbaab**, **bbbaa**, **bbbb**}

# Language Exponentiation

We can define what it means to "exponentiate" a language as follows:

 $L<sup>0</sup> = {ε}$ 

The set containing just the empty string.

Idea: Any string formed by concatenating zero strings together is the empty string.

 $L^{n+1} = L^{n}$ 

Idea: Concatenating (*n*+1) strings together works by concatenating *n* strings, then concatenating one more.

**Question to ponder:** Why define  $L^0 = \{\epsilon\}$ ?

**Question to ponder:** What is  $\varnothing^0$ ?

# The Kleene Closure

An important operation on languages is the *Kleene Closure*, which is defined as

 $L^* = \{ w \in \Sigma^* \mid \exists n \in \mathbb{N}, w \in L^n \}$ 

Mathematically:

#### $w \in L^*$  iff  $\exists n \in \mathbb{N}$ ,  $w \in L^n$

Intuitively, all possible ways of concatenating zero or more strings in *L* together, possibly with repetition.

*Question to ponder:* What is Ø\*?

### The Kleene Closure

If  $L = \{ a, bb \}$ , then  $L^* = \{$ 

ε,

#### **a**, **bb**,

#### **aa**, **abb**, **bba**, **bbbb**,

**aaa**, **aabb**, **abba**, **abbbb**, **bbaa**, **bbabb**, **bbbba**, **bbbbbb**,

…

Think of L<sup>\*</sup> as the set of strings you can make if you have a collection of stamps – one for each string in *L* – and you form every possible string that can be made from those stamps.

# Reasoning about Infinity

If *L* is regular, is *L*\* necessarily regular?

- *∧* **A Bad Line of Reasoning: ∧**
- $L^0 = \{\varepsilon\}$  is regular.
- $L^1 = L$  is regular.
- $L^2 = LL$  is regular
- $L^3 = L(LL)$  is regular

…

Regular languages are closed under union. So the union of all these languages is regular.

# Reasoning about Infinity














### $0.9 < 1$

 $0.99 < 1$ 

 $0.999 < 1$ 

### $0.9999 < 1$

### $0.99999 < 1$

#### $\sqrt{0.99999} \neq 1$

#### ∞ is finite

#### $\infty$  is finite ^ not

# Reasoning About the Infinite

If a series of finite objects all have some property, the "limit" of that process *does not* necessarily have that property.

In general, it is not safe to conclude that some property that always holds in the finite case must hold in the infinite case. (This is why calculus is interesting).

*Idea:* Can we directly convert an NFA for language *L* to an NFA for language *L*\*?













Machine for *L\**



Machine for *L\**

# Closure Properties

*Theorem:* If  $L_1$  and  $L_2$  are regular languages over an alphabet  $\Sigma$ , then so are the following languages:

*L*<sub>1</sub>

- *L*₁ ∪ *L*₂
- $L_1 \cap L_2$

 $I_{.1}I_{.2}$ 

 $L_1*$ 

These properties are called *closure properties of the regular languages*.

## Next Time

#### *Regular Expressions*

Building languages from the ground up!

#### *Thompson's Algorithm*

A UNIX Programmer in Theoryland.

#### *Kleene's Theorem*

From machines to programs!

# Thought for the Weekend

#### Learning How to Learn