## |5-25| <br> Great Theoretical Ideas in Computer Science

## Lecture 3:

Deterministic Finite Automata (DFA)


September 8th, 2015

## This Week



What is computation?
What is an algorithm?
How can we mathematically define them?

## Let's assume two things about our world

No universal machines exist.


Sorting

We only have machines to solve decision problems.


What is computation?
What is an algorithm?
How can we mathematically define them?
Today:
How do we represent information/data?
What is a computational problem?
Introducing deterministic finite automata (DFA)

## Examples of computational problems



## Examples of computational problems



## Examples of computational problems



## Examples of computational problems



Instance
[vanilla, mind, Ariel, yogurt, doesn't]

## Solution

[Ariel, doesn't, mind, vanilla, yogurt]

## Representing information

## Familiar idea:

Information in a computer is represented with 0 s and Is.

Can encode/represent any kind of data (numbers, text, pairs of numbers, graphs, images, etc...) with a finite length binary string.

## Representing information

> alphabet symbols of the alphabet
$\Sigma^{*}=$ the set of all finite length strings over $\Sigma$

$$
\begin{aligned}
\Sigma^{*}= & \{\epsilon, 0,1,00,01,10,11,000,001,010,011,100,101,110,111, \ldots\} \\
& \downarrow \\
& \text { string of length } 0 \text { (empty string) }
\end{aligned}
$$

A subset $L \subseteq \Sigma^{*}$ is called a language.

## Representing information

$$
\begin{aligned}
& \Sigma=\{a, b\} \\
& \Sigma=\{a, b, c\} \\
& \Sigma=\{0,1,2,3,4,5,6,7,8,9\} \\
& \Sigma=\{0,1,2,3,4,5,6,7,8,9, a, b, c, d, e, f, g, h, i, j, k, \\
&l, m, n, o, p, q, r, s, t, u, v, w, x, y, z\}
\end{aligned}
$$

Can use whichever is convenient.

## What is a computational problem?

## Let $\Sigma=\{0,1\}$.

The palindrome computational problem is:

| Instance | Solution |  |
| :---: | :---: | :---: |
| $\epsilon$ | 1 | Yes |
| 0 | 1 | Yes |
| 1 | 1 | Yes |
| 00 | 1 | Yes |
| 01 | 0 | No |
| 10 | 0 | No |
| 11 | 1 | Yes |
| 000 | 1 | Yes |
| 001 | 0 | No |

## What is a computational problem?

Let $\Sigma=\{0,1,2,3,4,5,6,7,8,9, \#\}$.
The multiplication computational problem is:


## What is a computational problem?

Definition: A computational problem is a function

$$
f: \Sigma^{*} \rightarrow \Sigma^{*}
$$

Definition: A decision problem is a function

$$
f: \Sigma^{*} \rightarrow\{0,1\}
$$

No,Yes
False,True
Reject,Accept

## What is a computational problem?

## Important

There is a one-to-one correspondence between decision problems and languages.
Instance Solution $L \subseteq \Sigma^{*}$



What is computation?
What is an algorithm?
How can we mathematically define them?
Today:
How do we represent information/data?
What is a computational problem?
Introducing deterministic finite automata (DFA)


What is computation?
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Introducing deterministic finite automata (DFA)

## Introducing deterministic finite automata (DFA)



- restricted model of computation
- very limited memory
- reads input from left to right, and accepts or rejects. (one pass through the input)


## State diagram of a DFA

$$
\Sigma=\{0,1\}
$$



## State diagram of a DFA

## $\Sigma=\{0,1\}$



## State diagram of a DFA

$$
\Sigma=\{0,1\}
$$



## Simulation of a DFA

## $\Sigma=\{0,1\}$

Input: 1010

## Simulation of a DFA

$\Sigma=\{0,1\}$
Input: 1010


## Simulation of a DFA

## $\Sigma=\{0,1\}$

Input: 1010


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## $\Sigma=\{0,1\}$

Input: 1010


## Simulation of a DFA

$\Sigma=\{0,1\}$
Input: 1010

## Decision: Reject



## Simulation of a DFA

## $\Sigma=\{0,1\}$

Input: 0|l||


## Simulation of a DFA

## $\Sigma=\{0,1\}$

Input: 0|l||


## Simulation of a DFA

## $\Sigma=\{0,1\}$

Input: 01111

## Simulation of a DFA

## $\Sigma=\{0,1\}$

Input: 01111


## Simulation of a DFA

## $\Sigma=\{0,1\}$

Input: 01111


## Simulation of a DFA

## $\Sigma=\{0,1\}$

Input: 01111


## Simulation of a DFA

## $\Sigma=\{0,1\}$

Input: 01III


## Simulation of a DFA

## $\Sigma=\{0,1\}$

## Decision: Accept

Input: 0|l||


## Anatomy of a DFA


transition rule: labeled arrows

## DFA as a programming language

def foo(input):
$\mathrm{i}=0$;


STATE 0:
if (i == input.length): return False;
letter $=\operatorname{input}[\mathrm{i}]$;
i++;
switch(letter):
case ' 0 ': go to STATE 0; case '1': go to STATE 1;

## STATE 1:

if ( $\mathrm{i}==$ input.length): return True; letter $=$ input[i];
i++;
switch(letter):
case ' 0 ': go to STATE 2;
case ' 1 ': go to STATE 2;


## DFA as a programming language

def foo(input):
$\mathrm{i}=0$;

## STATE 0 .

if (i == input.length): return False;
letter $=\operatorname{input}[1]$;
i++;
switch(letter):
case ' 0 ': go to STATE 0; case '1': go to STATE 1;

## STATE 1:

if ( $\mathrm{i}==$ input.length): return True; letter $=$ input[i];
i++;
switch(letter): case ' 0 ': go to STATE 2; case ' 1 ': go to STATE 2;


Have we reached end of input? Is it an accepting state?


## DFA as a programming language

def foo(input):
$\mathrm{i}=0$; STATE 0:
if (i == input.length): return False;
letter $=$ input[i];
i++;

switch(letter):
case ' 0 ': go to STATE $\mathbf{0}$; case '1': go to STATE 1;

## STATE 1:

if ( $\mathrm{i}==$ input.length): return True; letter $=\operatorname{input}[\mathrm{i}]$;
i++;
switch(letter):
case ' 0 ': go to STATE 2;
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## DFA as a programming language

def foo(input):
$\mathrm{i}=0$;

## STATE 0:

if (i == input.length): return False;
letter $=$ input[i];
i++;
switch(letter): case ' 0 ': go to STATE 0; case ' 1 ': go to STATE 1;


Depending on the letter change the state.

## STATE 1:

if ( $\mathrm{i}==$ input.length): return True; letter $=$ input[i];
i++;
switch(letter): case ' 0 ': go to STATE 2; case ' 1 ': go to STATE 2;


## DFA as a programming language

def foo(input):
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STATE 0:
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## STATE 1:

if (i == input.length): return True; letter $=$ input[i];
i++;
switch(letter):
case ' 0 ': go to STATE 2;
case ' 1 ': go to STATE 2 ;


## Definition: Language decided by a DFA

Let $M$ be a DFA.
We let $L(M)$ denote the set of strings that $M$ accepts.

So, $L(M)=\left\{x \in \Sigma^{*}: M(x)\right.$ accepts. $\} \subseteq \Sigma^{*}$

If $L=L(M)$, we say that $M$ decides $L$.
computes
recognizes
accepts

## DFA Examples


$L(M)=$ all binary strings with an even number of I's

$$
=\left\{x \in\{0,1\}^{*}: x \text { has an even number of } 1 \text { 's }\right\}
$$

## DFA Examples


$L(M)=$ all binary strings with even length

$$
=\left\{x \in\{0,1\}^{*}:|x| \text { is even }\right\}
$$

## DFA Examples


$L(M)=\left\{x \in\{0,1\}^{*}: x\right.$ ends with a 0$\} \cup\{\epsilon\}$

## DFA Examples

$$
\Sigma=\{a, b, c\}
$$


$L(M)=\{a, b, c b, c c\}$

## DFA Examples

## Draw a DFA that decides

$L=\left\{x \in\{0,1\}^{*}: x\right.$ starts and ends with same bit. $\}$

Hint: How do you decide all strings that end with a 0 ? How do you decide all strings that end with a I ?

## Poll



The set of all words that contain at least three O's
The set of all words that contain at least two 0's
The set of all words that contain 000 as a substring
The set of all words that contain 000 as a substring
The set of all words that contain 00 as a substring
The set of all words ending in 000
The set of all words ending in 00
None of the above
Beats me

## DFA construction practice

$$
\begin{aligned}
L & =\{110,101\} \\
L & =\{0,1\}^{*} \backslash\{110,101\} \\
L & =\left\{x \in\{0,1\}^{*}: x \text { starts and ends with same bit. }\right\} \\
L & =\left\{x \in\{0,1\}^{*}:|x| \text { is divisible by } 2 \text { or } 3 .\right\} \\
L & =\{\epsilon, 110,110110,110110110, \ldots\} \\
L & =\left\{x \in\{0,1\}^{*}: x \text { contains the substring } 110 .\right\} \\
L & =\left\{x \in\{0,1\}^{*}: 10 \text { and } 01 \text { occur equally often in } x .\right\}
\end{aligned}
$$

## Formal definition: DFA

A deterministic finite automaton (DFA) $M$ is a 5 -tuple

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

where

- $Q$ is a finite set (which we call the set of states);
- $\Sigma$ is a finite set (which we call the alphabet);
- $\delta$ is a function of the form $\delta: Q \times \Sigma \rightarrow Q$ (which we call the transition function);
- $q_{0} \in Q$ is an element of $Q$
(which we call the start state);
- $F \subseteq Q$ is a subset of $Q$
(which we call the set of accepting states).


## Formal definition: DFA

A deterministic finite automaton (DFA) $M$ is a 5 -tuple

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



$$
\begin{aligned}
& Q=\left\{q_{0}, q_{1}, q_{2}, q_{3}\right\} \\
& \Sigma=\{0,1\} \\
& \delta: Q \times \Sigma \rightarrow Q \\
& \begin{array}{|c|c|c|}
\hline \delta & 0 & 1 \\
\hline q_{0} & q_{0} & q_{1} \\
\hline q_{1} & q_{2} & q_{2} \\
\hline q_{2} & q_{3} & q_{2} \\
\hline q_{3} & q_{0} & q_{2} \\
\hline
\end{array}
\end{aligned}
$$

$q_{0}$ is the start state

$$
F=\left\{q_{1}, q_{2}\right\}
$$

## Formal definition: DFA accepting a string

Let $w=w_{1} w_{2} \cdots w_{n}$ be a string over an alphabet $\Sigma$.
Let $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$ be a DFA.
We say that $M$ accepts the string $w$ if there exists a sequence of states $r_{0}, r_{1}, \ldots, r_{n} \in Q$ such that

- $r_{0}=q_{0}$;
- $\delta\left(r_{i-1}, w_{i}\right)=r_{i} \quad$ for each $i \in\{1,2, \ldots, n\}$;
- $r_{n} \in F$.

Otherwise we say $M$ rejects the string $w$.

## Definition: Regular languages

Definition: A language $L$ is called regular if $L=L(M)$ for some DFA $M$.

## Regular languages



## Regular languages

## Questions:

I. Are all languages regular?
(Are all decision problems computable by a DFA?)
2. Are there other ways to tell if a language is regular?

## A non-regular language

## Theorem:

The language $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$ is not regular.

Note on notation:
For $a \in \Sigma, \quad a^{n}$ denotes the string $\underbrace{a a \cdots a}$.

$$
a^{0}=\epsilon
$$

For $u, v \in \Sigma^{*}, u v$ denotes $u$ concatenated with $v$.

So $L=\{\epsilon, 01,0011,000111,00001111, \ldots\}$.

## A non-regular language

## Theorem:

The language $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$ is not regular.

## Intuition:

Seems like the DFA would need to remember how many 0's it sees.

But it has a constant number of states.
And no other way of remembering things.
Careful though:
$L=\left\{x \in\{0,1\}^{*}: 10\right.$ and 01 occur equally often in $\left.x.\right\}$ is regular!

## A non-regular language

## Warm-up:

Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000|l|l|l||
$\uparrow$


## A non-regular language

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Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000|l|l|l|| $\uparrow$



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Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000|l|l|l|l $\uparrow$


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Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000|l|l|l| $\uparrow$


## $q_{2}$



## A non-regular language

## Warm-up:

Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000|l|l|l| $\uparrow$


## A non-regular language

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Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000|l|l|l|| $\uparrow$


## A non-regular language

## Warm-up:

Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000||l|l|l| $\uparrow$


## A non-regular language

## Warm-up:

Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000||l|l|l| $\uparrow$


## A non-regular language

## Warm-up:

Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000||l|l|l| $\uparrow$

$q_{2}$

## imagine some

arbitrary transitions


## A non-regular language

## Warm-up:

Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000|l|l|l| $\uparrow$



## A non-regular language

## Warm-up:

Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$. Input: 00000000|ll|l|l| $\uparrow$


## A non-regular language

## Warm-up:

Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$.

Input: 000000001IIIIIII $\uparrow$

After 00 and 000000 we ended up in the same state $q_{3}$.


But
001I $\rightarrow$ accept $00000011 \rightarrow$ reject

## A non-regular language

## Warm-up:

Suppose a DFA with 6 states decides $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$.

Input: 00000000IIIIIIII
Pigeonhole Principle
Where will 0000000 go?


## A non-regular language

## Theorem:

The language $L=\left\{0^{n} 1^{n}: n \in \mathbb{N}\right\}$ is not regular.
Proof: Suppose $L$ is regular.
So there is a DFA $M$ that decides $L$.
Let $k$ denote the number of states of $M$.
Let $r_{n}$ denote the state $M$ is in after reading $0^{n}$.
By PHP, there exists $i, j \in\{0,1, \ldots, k\}, i \neq j$, such that $r_{i}=r_{j}$. So $0^{i}$ and $0^{j}$ end up in the same state.
For any string $w, 0^{i} w$ and $0^{j} w$ end up in the same state.
But for $w=1^{i}, 0^{i} w$ should end up in an accepting state, and $0^{j} w$ should end up in a rejecting state.
This is the desired contradiction.

## Proving a language is not regular

Usually the proof goes like:
I. Assume (to reach a contradiction) that the language is regular. So a DFA decides it.
2. Argue by PHP that there are two strings $x$ and $y$ that lead to the same state in the DFA.
3. Find a string $z$ such that $x z \in L$ but $y z \notin L$.

## Regular languages



## Regular languages



## Regular languages

## Questions:

I. Are all languages regular?
(Are all decision problems computable by a DFA?)
2. Are there other ways to tell if a language is regular?

## Regular languages are closed under union

For $L_{1}, L_{2} \subseteq \Sigma^{*}$,

$$
L_{1} \cup L_{2}=\left\{x \in \Sigma^{*}: x \in L_{1} \text { or } x \in L_{2}\right\}
$$

## Theorem:

Let $\Sigma$ be some finite alphabet. If $L_{1} \subseteq \Sigma^{*}$ and $L_{2} \subseteq \Sigma^{*}$ are regular, then so is $L_{1} \cup L_{2}$.

Proof: Let $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$ be the decider for $L_{1}$ and $M^{\prime}=\left(Q^{\prime}, \Sigma, \delta^{\prime}, q_{0}^{\prime}, F^{\prime}\right)$ be the decider for $L_{2}$.
We construct a DFA $M^{\prime \prime}=\left(Q^{\prime \prime}, \Sigma, \delta^{\prime \prime}, q_{0}^{\prime \prime}, F^{\prime \prime}\right)$ that decides $L_{1} \cup L_{2}$, as follows:

## Regular languages are closed under union

## Example

$$
L_{1}=\begin{aligned}
& \text { strings with even } \\
& \text { number of I's }
\end{aligned}
$$

$L_{2}=$ strings with length divisible by 3.


## Regular languages are closed under union



## Regular languages are closed under union



## Regular languages are closed under union



## Regular languages are closed under union



## Regular languages are closed under union



## Regular languages are closed under union



## Regular languages are closed under union



## Regular languages are closed under union

Input: 101001

## Regular languages are closed under union

Input: 101001

Accept


## Regular languages are closed under union

Main idea:
Construct a DFA that keeps track of both at once.


## Regular languages are closed under union

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## Regular languages are closed under union

## Main idea:

Construct a DFA that keeps track of both at once.


## Regular languages are closed under union

Input: 101001
$\uparrow$


## Regular languages are closed under union

Input: 101001
$\uparrow$


## Regular languages are closed under union

Input: 101001
$\uparrow$


## Regular languages are closed under union

Input: 101001 $\uparrow$


## Regular languages are closed under union

Input: 101001 $\uparrow$


## Regular languages are closed under union

## Input: 101001

$\uparrow$


## Regular languages are closed under union

## Input: 101001

$\uparrow$


## Regular languages are closed under union

## Input: 101001 <br> $\uparrow$



## Regular languages are closed under union

## Input: 101001 <br> $\uparrow$



## Regular languages are closed under union

## Input: 101001

$\uparrow$


## Regular languages are closed under union

Input: 101001
$\uparrow$


## Regular languages are closed under union

## Input: $10100 \mid$



## Regular languages are closed under union

## Input: 101001



## Regular languages are closed under union

## Input: $10100 \mid$

Decision: Accept


## Regular languages are closed under union

## Theorem:

Let $\Sigma$ be some finite alphabet.
If $L_{1} \subseteq \Sigma^{*}$ and $L_{2} \subseteq \Sigma^{*}$ are regular, then so is $L_{1} \cup L_{2}$.
Proof: Let $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$ be the decider for $L_{1}$ and $M^{\prime}=\left(Q^{\prime}, \Sigma, \delta^{\prime}, q_{0}^{\prime}, F^{\prime}\right)$ be the decider for $L_{2}$. We construct a DFA $M^{\prime \prime}=\left(Q^{\prime \prime}, \Sigma, \delta^{\prime \prime}, q_{0}^{\prime \prime}, F^{\prime \prime}\right)$ that decides $L_{1} \cup L_{2}$, as follows:

- $Q^{\prime \prime}=Q \times Q^{\prime}=\left\{\left(q, q^{\prime}\right): q \in Q, q^{\prime} \in Q^{\prime}\right\}$
- $\delta^{\prime \prime}\left(\left(q, q^{\prime}\right), a\right)=\left(\delta(q, a), \delta^{\prime}\left(q^{\prime}, a\right)\right)$
- $q_{0}^{\prime \prime}=\left(q_{0}, q_{0}^{\prime}\right)$
- $F^{\prime \prime}=\left\{\left(q, q^{\prime}\right): q \in F\right.$ or $\left.q^{\prime} \in F^{\prime}\right\}$


## Regular languages are closed under union

Proof: Let $M=\left(Q, \Sigma, \delta, q_{0}, F\right)$ be the decider for $L_{1}$ and $M^{\prime}=\left(Q^{\prime}, \Sigma, \delta^{\prime}, q_{0}^{\prime}, F^{\prime}\right)$ be the decider for $L_{2}$. We construct a DFA $M^{\prime \prime}=\left(Q^{\prime \prime}, \Sigma, \delta^{\prime \prime}, q_{0}^{\prime \prime}, F^{\prime \prime}\right)$ that decides $L_{1} \cup L_{2}$, as follows:

$$
\begin{aligned}
& -Q^{\prime \prime}=Q \times Q^{\prime}=\left\{\left(q, q^{\prime}\right): q \in Q, q^{\prime} \in Q^{\prime}\right\} \\
& -\delta^{\prime \prime}\left(\left(q, q^{\prime}\right), a\right)=\left(\delta(q, a), \delta^{\prime}\left(q^{\prime}, a\right)\right) \\
& -q_{0}^{\prime \prime}=\left(q_{0}, q_{0}^{\prime}\right) \\
& -F^{\prime \prime}=\left\{\left(q, q^{\prime}\right): q \in F \text { or } q^{\prime} \in F^{\prime}\right\}
\end{aligned}
$$

It remains to show that $L\left(M^{\prime \prime}\right)=L_{1} \cup L_{2}$. $L\left(M^{\prime \prime}\right) \subseteq L_{1} \cup L_{2}:$
$L_{1} \cup L_{2} \subseteq L\left(M^{\prime \prime}\right):$

## More "closure" properties

## Closed under union:

$L_{1}, L_{2}$ regular $\Longrightarrow L_{1} \cup L_{2}$ regular.

Closed under concatenation:
$L_{1}, L_{2}$ regular $\Longrightarrow L_{1} \cdot L_{2}$ regular.

$$
L_{1} \cdot L_{2}=\left\{x y: x \in L_{1}, y \in L_{2}\right\}
$$

Closed under star:
$L$ regular $\Longrightarrow L^{*}$ regular.

$$
L^{*}=\left\{x_{1} x_{2} \cdots x_{k}: k \geq 0, \forall i x_{i} \in L\right\}
$$

## More "closure" properties

## Fact:

Starting with $\emptyset$ and $\{a\}$ for each $a \in \Sigma$ can construct any regular language using union, concatenation, star.

$$
a(a \cup b)^{*} a \cup b(a \cup b)^{*} b \cup a \cup b
$$

(regular expression)

## Next Time



