# 1 Introducing Nondeterminism

### 1.1 Informal Overview

#### Nondeterminism

Michael Rabin and Dana Scott (1959)



Figure 1: Michael Rabin



Figure 2: Dana Scott

### Nondeterminism

Given a current state of the machine and input symbol to be read, the next state is not uniquely determined.

## Comparison to DFAs

## Nondeterministic Finite Automata (NFA)

NFAs have 3 features when compared with DFAs.

- 1. Ability to take a step without reading any input symbol
- 2. A state may have no transition on a particular symbol
- 3. Ability to transition to more than one state on a given symbol

### $\epsilon$ -Transitions

Transitions without reading input symbols

Example 1. The British spelling of "color" is "colour". In a web search application, you may want to recognize both variants.



Figure 3: NFA with  $\epsilon$ -transitions

### No transitions



Figure 4: No 0-transition out of initial state

In the above automaton, if the string starts with a 0 then the string has no computation (i.e., rejected).

## **Multiple Transitions**

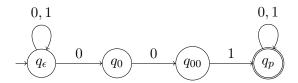


Figure 5:  $q_{\epsilon}$  has two 0-transitions

# 1.2 Nondeterministic Computation

### Parallel Computation View

At each step, the machine "forks" a thread corresponding to one of the possible next states.

- If a state has an  $\epsilon$ -transition, then you fork a new process for each of the possible  $\epsilon$ -transitions, without reading any input symbol
- If the state has multiple transitions on the current input symbol read, then fork a process for each possibility
- If from current state of a thread, there is no transition on the current input symbol then the thread dies

# Parallel Computation View: An Example

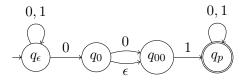


Figure 6: Example NFA

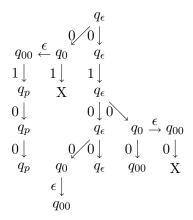
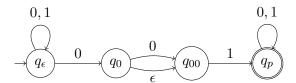


Figure 7: Computation on 0100

# Nondeterministic Acceptance

Parallel Computation View

Input is *accepted* if after reading all the symbols, one of the live threads of the automaton is in a final/accepting state. If none of the live threads are in a final/accepting state, the input is *rejected*.



0100 is accepted because one thread of computation is  $q_{\epsilon} \stackrel{0}{\to} q_0 \stackrel{\epsilon}{\to} q_{00} \stackrel{1}{\to} q_p \stackrel{0}{\to} q_p \stackrel{0}{\to} q_p$ 

## Computation: Guessing View

The machine magically guesses the choices that lead to acceptance

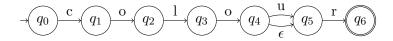


Figure 8: NFA  $M_{color}$ 

After seeing "colo" the automaton guesses if it will see the british or the american spelling. If it guesses american then it moves without reading the next input symbol.

# Observations: Guessing View

- If there is a sequence of choices that will lead to the automaton (not "dying" and) ending up in an accept state, then those choices will be magically guessed
- On the other hand, if the input will not be accepted then no guess will lead the to automaton being in an accept state
  - On the input "colobr", whether automaton  $M_{color}$  guesses british or american, it will not proceed when it reads 'b'.

# 2 Formal Definitions

### 2.1 NFAs

# Nondeterministic Finite Automata (NFA)

Formal Definition

**Definition 3.** A nondeterministic finite automaton (NFA) is  $M = (Q, \Sigma, \delta, q_0, F)$ , where

- Q is the finite set of states
- $\Sigma$  is the finite alphabet
- $\delta: Q \times (\Sigma \cup {\epsilon}) \to \mathcal{P}(Q)$ , where  $\mathcal{P}(Q)$  is the powerset of Q
- $q_0 \in Q$  initial state
- $F \subseteq Q$  final/accepting states

### Example of NFA

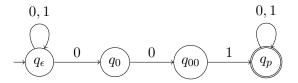


Figure 9: Transition Diagram of NFA

Formally, the NFA is  $M_{001} = (\{q_{\epsilon}, q_0, q_{00}, q_p\}, \{0, 1\}, \delta, q_{\epsilon}, \{q_p\})$  where  $\delta$  is given by

$$\begin{array}{ll} \delta(q_{\epsilon},0) = \{q_{\epsilon},q_{0}\} & \delta(q_{\epsilon},1) = \{q_{\epsilon}\} \\ \delta(q_{00},1) = \{q_{p}\} & \delta(q_{p},0) = \{q_{p}\} \end{array} \qquad \begin{array}{ll} \delta(q_{0},0) = \{q_{00}\} \\ \delta(q_{p},1) = \{q_{p}\} \end{array}$$

 $\delta$  is  $\emptyset$  in all other cases.

# 2.2 Nondeterministic Computation

### Computation

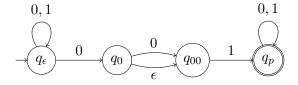
**Definition 4.** For an NFA  $M = (Q, \Sigma, \delta, q_0, F)$ , string w, and states  $q_1, q_2 \in Q$ , we say  $q_1 \xrightarrow{w}_M q_2$  if there is one thread of computation on input w from state  $q_1$  that ends in  $q_2$ . Formally,  $q_1 \xrightarrow{w}_M q_2$  if there is a sequence of states  $r_0, r_1, \ldots r_k$  and a sequence  $x_1, x_2, \ldots x_k$ , where for each  $i, x_i \in \Sigma \cup \{\epsilon\}$ , such that

- $r_0 = q_1$ ,
- for each  $i, r_{i+1} \in \delta(r_i, x_{i+1}),$
- $r_k = q_2$ , and
- $\bullet \ \ w = x_1 x_2 x_3 \cdots x_k$

### Differences with definition for DFA

- Since  $\delta$  gives a set of states, for each i,  $r_{i+1}$  is required to be in  $\delta(r_1, x_{i+1})$ , and not equal to it (as is the case for DFAs)
- Allowing/inserting  $\epsilon$  in to the input sequence

# **Example Computation**



 $q_{\epsilon} \xrightarrow{0100}_{M} q_{p}$  because taking  $r_{0} = q_{\epsilon}$ ,  $r_{1} = q_{0}$ ,  $r_{2} = q_{00}$ ,  $r_{3} = q_{p}$ ,  $r_{4} = q_{p}$ ,  $r_{5} = q_{p}$ , and  $x_{1} = 0$ ,  $x_{2} = \epsilon$ ,  $x_{3} = 1$ ,  $x_{4} = 0$ ,  $x_{5} = 0$ , we have

- $x_1 x_2 \cdots x_5 = 0 \epsilon 100 = 0100$
- $r_{i+1} \in \delta(r_i, x_{i+1})$

# Acceptance/Recognition

**Definition 5.** For an NFA  $M=(Q,\Sigma,\delta,q_0,F)$  and string  $w\in\Sigma^*$ , we say M accepts w iff  $q_0\xrightarrow{w}_M q$  for some  $q\in F$ .

**Definition 6.** The language accepted or recognized by NFA M over alphabet  $\Sigma$  is  $\mathbf{L}(M) = \{w \in \Sigma^* \mid M \text{ accepts } w\}$ . A language L is said to be accepted/recognized by M if  $L = \mathbf{L}(M)$ .

### **Useful Notation**

**Definition 7.** For an NFA  $M = (Q, \Sigma, \delta, q_0, F)$ , string w, and state  $q \in Q$ , we say  $\hat{\delta}_M(q, w)$  to denote states of all the active threads of computation on input w from q. Formally,

$$\hat{\delta}_M(q, w) = \{ q' \in Q \mid q \xrightarrow{w}_M q' \}$$

We could say M accepts w iff  $\hat{\delta}_M(q_0, w) \cap F \neq \emptyset$ .

#### Observation 1

For NFA M, string w and state  $q_1$  it could be that

- $\hat{\delta}_M(q_1, w) = \emptyset$
- $\hat{\delta}_M(q_1, w)$  has more than one element

### Observation 2

However, the following proposition about DFAs continues to hold for NFAs

For NFA M, strings u and v, and states  $q_1, q_2, q_1 \xrightarrow{uv}_M q_2$  iff there is a state q such that  $q_1 \xrightarrow{u}_M q$  and  $q \xrightarrow{v}_M q_2$ 

## Example

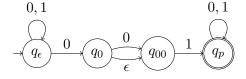


Figure 10: Example NFA

 $\hat{\delta}_M(q_{\epsilon}, 0100) = \{q_p, q_{00}, q_{\epsilon}\}$ 

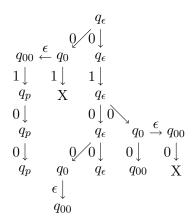


Figure 11: Computation on 0100

# 2.3 Examples

# ${\bf Example} \,\, {\bf I}$

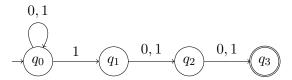


Figure 12: Automaton accepts strings having a 1 three positions from end of input

The automaton "guesses" at some point that the 1 it is seeing is 3 positions from end of input.

# Example II

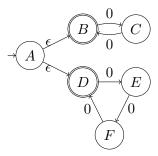


Figure 13: NFA accepting strings where the length is either a multiple 2 or 3

The NFA "guesses" at the beginning whether it will see a multiple of 2 or 3, and then confirms that the guess was correct.

## Example III

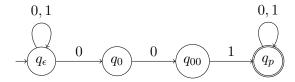


Figure 14: NFA accepting strings with 001 as substring

At some point the NFA "guesses" that the pattern 001 is starting and then checks to confirm the guess.

# 3 Power of Nondeterminism

## 3.1 Overview

# Using Nondeterminism

When designing an NFA for a language

- You follow the same methodology as for DFAs, like identifying what needs to be remembered
- But now, the machine can "guess" at certain steps

# 3.2 Examples

### Back to the Future

### **Problem**

For  $\Sigma = \{0, 1, 2\}$ , let

$$L = \{ w \# c \mid w \in \Sigma^*, \ c \in \Sigma, \text{ and } c \text{ occurs in } w \}$$

So  $1011\#0 \in L$  but  $1011\#2 \notin L$ . Design an NFA recognizing L.

# Solution

- Read symbols of w, i.e., portion of input before # is seen
- Guess at some point that current symbol in w is going to be the same as 'c'; store this symbol in the state
- $\bullet$  Read the rest of w
- On reading #, check that the symbol immediately after is the one stored, and that the input ends immediately after that.

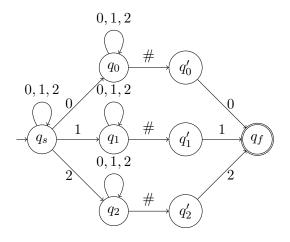


Figure 15:  $L(M) = \{ w \# c \mid c \text{ occurs in } w \}$ 

## Pattern Recognition

### **Problem**

For alphabet  $\Sigma$  and  $u \in \Sigma^*$ , let

$$L_u = \{ w \in \Sigma^* \mid \exists v_1, v_2 \in \Sigma^*. \ w = v_1 u v_2 \}$$

That is,  $L_u$  is all strings that have u as a substring.

## Solution

- $\bullet$  Read symbols of w
- Guess at some point that the string u is going to be seen
- Check that *u* is indeed read
- After reading u, read the rest of w

To do this, the automaton will remember in its state what prefix of u it has seen so far; the initial state will assume that it has not seen any of u, and the final state is one where all the symbols of u have been observed.

Formally, we can define this automaton as follows. Let  $u = a_1 a_2 \cdots a_n$ . The NFA  $M = (Q, \Sigma, \delta, q_0, F)$  where

- $Q = \{\epsilon, a_1, a_2a_2, a_1a_2a_3, \dots, a_1a_2 \cdots a_n = u\}$ . Thus, every prefix of u is a state of NFA M.
- $q_0 = \epsilon$ ,
- $\bullet \ F = \{u\},\$
- And  $\delta$  is given as follows

$$\delta(q,a) = \begin{cases} \{\epsilon\} & \text{if } q = \epsilon, \ a \neq a_1 \\ \{\epsilon, a_1\} & \text{if } q = \epsilon, \ a = a_1 \\ \{a_1 a_2 \cdots a_{i+1}\} & \text{if } q = a_1 \cdots a_i \ (1 \leq i < n), \ a = a_{i+1} \\ \{u\} & \text{if } q = u \\ \emptyset & \text{otherwise} \end{cases}$$

See Example III above for a concrete case.

### 1 k-positions from the end

#### **Problem**

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

$$L_k = \{ w \in \Sigma^* \mid \exists v_1, v_2 \in \Sigma^*. \ w = v_1 1 v_2 \text{ and } |v_2| = k - 1 \}$$

That is,  $L_k$  is all strings that have a 1 k positions from the end.

### Solution

- Read symbols of w
- Guess at some point that there are only going to be k more symbols in the input
- Check that the first symbol after this point is a 1, and that we see k-1 symbols after that
- Halt and accept no more input symbols

The states need to remember that how far we are from the end of the input; either very far (initial state), or less that k symbols from end.

Formally,  $M = (Q, \Sigma, \delta, q_0, F)$  where

- $Q = \{q_i \mid 0 \le i \le k\}$ . The subscript of the state counts how far we are from the end of the input;  $q_0$  means that there can be many symbols left before the end, and  $q_i$  (i > 1) means there are k i symbols left to read.
- $q_0 = q_0$
- $F = \{q_k\},$
- And  $\delta$  is given as follows

$$\delta(q, a) = \begin{cases} \{q_0\} & \text{if } q = q_0, \ a = 0\\ \{q_0, q_1\} & \text{if } q = q_0, \ a = 1\\ \{q_{i+1}\} & \text{if } q = q_i (1 \le i < k)\\ \emptyset & \text{otherwise} \end{cases}$$

See Example I above for a concrete case.

Observe that this automaton has only k+1 states, whereas we proved in lecture 3 that any DFA recognizing this language must have size at least  $2^k$ . Thus, NFAs can be exponentially smaller than DFAs.

**Proposition 8.** There is a family of languages  $L_k$  (for  $k \in \mathbb{N}$ ) such that the smallest DFA recognizing  $L_k$  has at least  $2^k$  states, whereas there is an NFA with only O(k) recognizing  $L_k$ .

*Proof.* Follows from the observations above.

### Halving a Language

**Definition 9.** For a language L, define  $\frac{1}{2}L$  as follows.

$$\frac{1}{2}L = \{x \mid \exists y. \, |x| = |y| \text{ and } xy \in L\}$$

In other words,  $\frac{1}{2}L$  consists of the first halves of strings in L

Example 10. If  $L = \{001, 0000, 01, 110010\}$  then  $\frac{1}{2}L = \{00, 0, 110\}$ .

### Recognizing Halves of Regular Languages

**Proposition 11.** If L is recognized by a DFA M then there is a NFA N such that  $L(N) = \frac{1}{2}L$ .

### **Proof Idea**

On input x, need to check if x is the first half of some string w = xy that is accepted by M.

- "Run" M on input x; let M be in state  $q_i$  after reading all of x
- Guess a string y such that |y| = |x|
- Check if M reaches a final state on reading y from  $q_i$

How do you guess a string y of equal length to x using finite memory? Seems to require remembering the length of x!

### Fixing the Idea

# Problem and Fix(?)

- How do you guess a string y of equal length to x using finite memory? Guess one symbol of y as you read one symbol of x!
- How do you "run" M on y from  $q_i$ , if you cannot store all the symbols of y? Run M on y as you guess each symbol, without waiting to finish the execution on x!
- If we don't first execute M on x, how do we know the state  $q_i$  from which we have to execute y from? Guess it! And then check that running M on x does indeed end in  $q_i$ , your guessed state.

# New Algorithm

On input x, NFA N

- 1. Guess state  $q_i$  and place "left finger" on (initial state of M)  $q_0$  and "right finger" on  $q_i$
- 2. As characters of x are read, N moves the left finger along transitions dictated by x and simultaneously moves the right finger along nondeterministically chosen transitions labelled by some symbol
- 3. Accept if after reading x, left finger is at  $q_i$  (state initially guessed for right finger) and right finger is at an accepting state

Things to remember: initial guess for right finger, and positions of left and right finger.

### Algorithm on Example

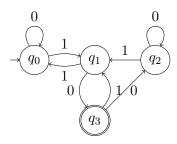


Figure 16: DFA M

 $100010 \in L$  and so  $x = 100 \in \frac{1}{2}L$ NFA N execution on x = 100 is

String Read	Left Finger		Right Finger
$\epsilon$	$q_0$	$\rightarrow$	$q_2$
1	$q_1$		$q_2$
10	$q_3$	=?	$q_1$
100	$q_2$	$\forall$	$q_3$
			<b>†</b>
			$\operatorname{accept}$ ?

## Formal Construction of NFA N

States and Initial State

Given  $M = (Q, \Sigma, \delta, q_0, F)$  recognizing L define  $N = (Q', \Sigma, \delta', q'_0, F')$  that recognizes  $\frac{1}{2}L$ 

- $Q' = Q \times Q \times Q \cup \{s\}$ , where  $s \notin Q$ 
  - -s is a new start state
  - Other states are of the form (left finger, initial guess, right finger); "initial guess" records the initial guess for the right finger
- $q_0' = s$
- Transitions

$$\delta'(s,\epsilon) = \{ \langle q_0, q_i, q_i \rangle \mid q_i \in Q \}$$
"Guess" the state  $q_i$  that the input will lead to
$$\delta'(\langle q_i, q_j, q_k \rangle, a) = \{ \langle q_l, q_j, q_m \rangle \mid \delta(q_i, a) = q_l, \\ \exists b \in \Sigma. \, \delta(q_k, b) = q_m \}$$

b is the guess for the next symbol of y and initial guess does not change

•  $F' = \{\langle q_i, q_i, q_j \rangle \mid q_i \in Q, q_j \in F\}$