# Finite-State Transducers

ANLP | 25 September 2017

slides from Marine Carpuat

#### Sheeptalk!



#### Regular Expression: /baa+!/





#### Accept or Generate?

- Formal languages are sets of strings
  - Strings composed of symbols drawn from a finite alphabet
- Finite-state automata define formal languages
  - Without having to enumerate all the strings in the language
- Two views of FSAs:
  - Acceptors that can tell you if a string is in the language
  - **Generators** to produce all and only the strings in the language



## Define an FSA representing the language of all non-zero binary strings of even length



## Define an FSA representing the language of all non-zero binary strings of odd length

#### Introducing Non-Determinism

• Deterministic vs. Non-deterministic FSAs



• Epsilon ( $\epsilon$ ) transitions b a a !  $q_0$   $q_1$   $q_2$   $q_3$   $q_4$ 

#### Using NFSAs to Accept Strings

- What does it mean?
  - Accept: there exist at least one path (need not be all paths)
  - Reject: no paths exist
- General approaches
  - Backup: add markers at choice points, then possibly revisit unexplored arcs at marked choice point
  - Explore paths in parallel
  - Recognition with NFSAs as search through state space

#### What's the point?

NFSAs and DFSAs are equivalent

 For every NFSA, there is a equivalent DFSA (and vice versa)

 Equivalence between regular expressions and FSA

• Why use NFSAs?

#### Regular Language: Definition

- $\varnothing$  is a regular language
- $\forall a \in \Sigma \cup \varepsilon$ ,  $\{a\}$  is a regular language
- If L<sub>1</sub> and L<sub>2</sub> are regular languages, then so are:
  - $-L_1 \cdot L_2 = \{x \ y \ | \ x \in L_1 \ , \ y \in L_2 \}$ , the concatenation of  $L_1$  and  $L_2$
  - $L_1 \cup L_2$ , the *union* or *disjunction* of  $L_1$  and  $L_2$ -  $L_1*$ , the *Kleene closure* of  $L_1$

#### Regular Languages: Starting Points



#### Regular Languages: Concatenation



#### Regular Languages: Disjunction



#### Regular Languages: Kleene Closure



#### Finite-State Transducers (FSTs)

- A two-tape automaton that recognizes or generates pairs of strings
- Think of an FST as an FSA with two symbol strings on each arc



#### Four-fold view of FSTs

- As a recognizer
- As a generator
- As a translator
- As a set relater

### Morphological Parsing

- Computationally decompose input forms into component morphemes
- Components needed:
  - A lexicon (stems and affixes)
  - A model of how stems and affixes combine
  - Orthographic rules

#### Morphological Parsing: Examples

WORD STEM (+FEATURES)

cats cat +N +PL

cat cat +N +SG

cities city +N +PL

geese goose +N +PL

ducks (duck +N +PL) or (duck +V +3SG)

merging merge +V +PRES-PART

caught (catch +V +PAST-PART) or (catch +V +PAST)

#### Different Approaches

- Lexicon only
- Rules only
- Lexicon and rules
  - finite-state automata
  - finite-state transducers

#### Lexicon-only

 Simply enumerate all surface forms and analyses

acclaim	acclaim \$N\$
acclaim	acclaim \$V+0\$
acclaimed	acclaim \$V+ed\$
acclaimed	acclaim \$V+en\$
acclaiming	acclaim \$V+ing\$
acclaims	acclaim \$N+s\$
acclaims	acclaim \$V+s\$
acclamation	acclamation \$N\$
acclamations	acclamation \$N+s\$
acclimate	acclimate \$V+0\$
acclimated	acclimate \$V+ed\$
acclimated	acclimate \$V+en\$
acclimates	acclimate \$V+s\$
acclimating	acclimate \$V+ing\$

#### Rule-only

- Cascading set of rules
  - $S \rightarrow E$
  - ation  $\rightarrow$  e
  - ize  $\rightarrow \epsilon$
  - ...

- Example
  - generalizations
    - $\rightarrow$  generalization
    - $\rightarrow$  generalize
    - $\rightarrow$  general

- organizations
  - $\rightarrow$  organization
  - $\rightarrow$  organize
  - → organ

#### Lexicon + Rules

• FSA: for recognition

Recognize all grammatical input and only grammatical input

- FST: for analysis
  - If grammatical, analyze surface form into component morphemes
  - Otherwise, declare input ungrammatical

#### FSA: English Noun Morphology

reg-noun	irreg-pl-noun	irreg-sg-noun	plural
fox	geese	goose	-S
cat	sheep	sheep	
dog	mice	mouse	





#### FSA: English Adjectival Morphology

- Examples:
  - big, bigger, biggest
  - small, smaller, smallest
  - happy, happier, happiest, happily
  - unhappy, unhappier, unhappiest, unhappily
- Morphemes:
  - Roots: big, small, happy, etc.
  - Affixes: un-, -er, -est, -ly

#### FSA: English Adjectival Morphology





### Morphological Parsing with FSTs

- Limitation of FSA:
  - Accepts or rejects an input... but doesn't actually provide an analysis
- Use FSTs instead!
  - One tape contains the input, the other tape as the analysis



#### Terminology

- Transducer alphabet (pairs of symbols):
  - -a:b = a on the upper tape, b on the lower tape
  - $-a:\epsilon = a$  on the upper tape, nothing on the lower tape
  - If a:a, write a for shorthand
- Special symbols
  - # = word boundary
  - ^ = morpheme boundary
  - (For now, think of these as mapping to  $\varepsilon$ )

#### FST for English Nouns



• What's the problem here?

#### FST for English Nouns





Name	Description of Rule	Example
Consonant	1-letter consonant doubled before -ing/-ed	beg/begging
doubling		
E deletion	silent e dropped before <i>-ing</i> and <i>-ed</i>	make/making
E insertion	e added after - <i>s</i> ,- <i>z</i> ,- <i>x</i> ,- <i>ch</i> , - <i>sh</i> before - <i>s</i>	watch/watches
Y replacement	-y changes to - <i>ie</i> before -s, - <i>i</i> before - <i>ed</i>	try/tries
K insertion	verbs ending with $vowel + -c$ add $-k$	panic/panicked

#### **Complete Morphological Parser**



### **Regular Relations**

- A regular relation describes:
  - for every state change in a regular automaton
  - a finite set of possible outputs
- Regular relations are like bilingual dictionaries for two regular languages
  - They allow inversion (we can go from L2 <> L1)
  - Allow composition (L1 > L2, L2 > L3  $\rightarrow$  L1 > L3)



#### FSTs and Ambiguity

- unionizable
  - union +ize +able
  - un+ ion +ize +able
- assess
  - assess +V
  - ass +N +essN

#### Practical NLP Applications

- In practice, it is almost never necessary to write FSTs by hand...
- Typically, one writes rules:
  - Chomsky and Halle Notation:  $a \rightarrow b / c_d$ 
    - = rewrite a as b when occurs between c and d
  - E-Insertion rule

$$\epsilon \rightarrow e / \begin{cases} x \\ s \\ z \end{cases} ^{n} s #$$

• Rule  $\rightarrow$  FST compiler handles the rest...