## HLT

#### Finite State Technology

University of Malta

Finite State Technology (UoM)

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Image: A matrix and a matrix

- Richard Sproat, Morphology and Computation, MIT Press, ISBN 0-262-19314-0 (1992)
- Shuly Wintner, Lecture Notes, 2008

## Outline

## Computational Morphology

- 2 Revision of Formal Language Theory
- 3 Regular Expressions
- 4 Finite State Automata
- 5 FSAs and Morphology

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- Morphology involves the relation between word forms and their constituent morphemes.
- enlargement, en + large + ment
- Computational morphology is the design of algorithms which computations over that relation.
- Computational morphology is two way:
  - Morphological Analysis
  - Morphological Synthesis
- Computational Morphology is not just about strings, but is also about meanings.

- Handling Segmentation: what are the parts into which the word is broken.
- Handling Morphotactics:
  - handling the order in which the parts combine together
  - computing the result
- Handling Phonological Alternations
  - pity is realized as piti in pitilessness
  - die becomes dy in dying
- Computational Morphology involves a concrete representation of the lexicon.

- Finite-state automata are a good model for representing the lexicon.
- They are also perfectly adequate for representing dictionaries (lexicons+additional information)
- They are also for describing morphological processes that involve concatenation etc.
- A natural extension of finite-state automata finite-state transducers are a perfect model for most processes known in morphology and phonology including non-segmental ones.

- Formal languages are defined with respect to a given alphabet Σ, which is a finite set of symbols, each of which is called a letter.
- A finite sequence of letters is called a string.
- String Length | w |
- Concatenation w<sub>1</sub>.w<sub>2</sub>
- Exponent  $w^n = w_1 \dots w_{n-1} \dots w_n$
- Reversal  $w^R$ . If  $w = \langle w_1, w_2 \dots w_n \rangle$  then  $w^R = \langle w_n, w_{n-1} \dots w_1 \rangle$
- Substring: If  $w = \langle x_1 \dots x_n \rangle$  then for any i, j such that  $1 \le i \le j \le n$  $\langle x_i \dots x_i \rangle$  is a substring of w.

• Two special cases of substring are *prefix* and *suffix*.

- If  $w = w_I . w_c . w_r$  then
  - w<sub>l</sub> is a prefix of w and
  - $w_r$  is a suffix of w

#### Example

- Let Σ = a, b, c, ... y, z be an be an alphabet and let w = indistinguishable a, string over Σ.
- Then  $\epsilon$  in, indis, indistinguish and indistinguishable are prefixes of w, while  $\epsilon$  e, able, distinguishable and indistinguishable are suffixes of w.
- Substrings that are neither prefixes nor suffixes include *distinguish*, *gui* and *is*.

# Formal Language

- $\bullet\,$  Given an alphabet  $\Sigma,$  the set of all strings over  $\Sigma,$  is denoted by  $\Sigma^*$
- A formal language over  $\Sigma$  is a subset of  $\Sigma^*$ .

#### Example

- Let  $\Sigma = a, b, c, \dots y, z$  be an be an alphabet.
- ullet The following are formal languages over  $\sigma$
- Σ\*
- the set of strings consisting of consonants only;
- the set of strings consisting of vowels only;
- the set of strings each of which contains at least one vowel and at least one consonant;
- the set of palindromes;

- String operations can be lifted to languages
- if L is a language then the *reversal* of L, denoted  $L^R$ , is the language

$$\{w \mid w^R \in L\}$$

• if  $L_1$  and  $L_2$  are languages, then the concatenation of  $L_1$  and  $L_2$ ,

$$L_1.L_2=\{w_1.w_2 \mid w_1\in L_1 ext{ and } w_2\in L_2\}$$

- $L_1 = \{i, you, he, she, it, we, they \}$
- $L_2 = \{\text{smile, sleep}\}$
- $L_2^R = \{\text{elims, peels}\}$
- $L_1.L_2 = \{\text{ismile, isleep, yousmile, yousleep, } \dots \text{ theysleep} \}$

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## Kleene Closure

• The Kleene Closure of L is denoted  $L^*$  and defined as



$$L^+ = \bigcup_{i=1}^{\infty} L^i.$$

 $\sum_{i=1}^{\infty} L^{i}$ .

i=0

#### Example

Let 
$$L = \{ dog, cat \}$$
.

• 
$$L^0 = \{\epsilon\}.$$

• 
$$L^1 = \{ dog, cat \},$$

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- Regular expressions are a formalism for defining (formal) languages.
- Their "syntax" is formally defined and is relatively simple.
- Their "semantics" is sets of strings
- The denotation of a regular expression is a set of strings in some formal language.

- 0 is an RE
- ϵ is an RE
- if  $a \in \Sigma$  is a letter then a is an RE
- if  $r_1$  and  $r_2$  are REs, then so are  $r_1 + r_2$  and  $r_1 \cdot r_2$
- if r is an RE then so is (r)\*
- nothing else is an RE over Σ

Let Σ = a, b, c, ... y, z be an be an alphabet. Some REs over Σ include

• 0

- ο ε
- ((c.a).t)
- (((m.e).(o))\*.w)
- (a + (e + (i + (o + u))))
- $(a + (e + (i + (o + u)))))^*$

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For every RE r its *denotation* [r] is defined as follows:

- $\bullet \ \llbracket 0 \rrbracket = 0$
- $\llbracket \epsilon \rrbracket = \{\epsilon\}$
- if  $a \in \Sigma$  is a letter than  $\llbracket a \rrbracket = a$
- if  $r_1$  and  $r_2$  are REs whose denotations are  $\llbracket r_1 \rrbracket$  and  $\llbracket r_2 \rrbracket$ , then

• 
$$[r_1 + r_2] = [r_1] \cup [r_2]$$
  
•  $[r_1.r_2] = [r_1].[r_2]$   
•  $[(r_1)^*] = [r_1]$ 

Example	
RE	DENOTATION
0	0
а	{a}
((c.a).t)	$\{c.a.t\}$
(((m.e).(0)*).w)	$\{mew, meow, meoow, meooow \ldots\}$
(a+(e+(i+(o+u))))	$\{a, e, i, o, u\}$
$(a + (e + (i + (o + u)))))^*$	all strings of vowels

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#### Definition

- A Language is **regular** if it is the denotation of some regular expression.
- Not all formal languages are regular
- Closure
  - A class of languages is said to be **closed** under some operation if and only if whenever two languages are in the class, the result of performing the operation on the two languages is also in this class.

## Regular Languages Equivalent Ways of Describing Regular Languages



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Regular languages are closed under:

- Union
- Intersection
- Complementation
- Difference
- Concatenation
- Kleene-star

- Zero or more a's followed by zero or more b's
- The set of words in an English dictionary
- Dates
- URLs
- English?

- Zero or more a's followed by exactly the same number of b's
- The set of all English palindromes
- The set that includes all noun phrases of the form
  - the cat slept
  - the cat the dog bit slept
  - the cat the dog the man fed bit slept

- Automata are models of computation.
- A finite state automaton (FSA) is a five-tuple  $< Q, q_0, \Sigma, \delta, F >$ , where
  - Q is a set of states
  - $q_0 \in Q$  is an initial state
  - $F \subseteq Q$  is a set of final states
  - $\Sigma$  is a finite set of symbols
  - $\delta$  is a relation  $Q imes \Sigma imes Q$

# FSA Example

## Example



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## Language Accepted by an FSA

#### ullet Define the reflexive transitive extension $oldsymbol{\Delta}$ of $\delta$

- for every state  $q \in Q, (q,\epsilon,q) \in \Delta$
- for every string  $w \in \Sigma^*$  and letter  $a \in \Sigma$ , if  $(q, w, q') \in \Delta$  and  $(q', w, q'') \in \delta$  then  $(q, w.a, q'') \in \Delta$
- A string w is accepted by an automaton if and only if there exists  $q_f \in Q$  such that

$$(q_0, w, q_f) \in \Delta$$

- The language accepted by a finite-state automaton is the set of all strings it accepts
- Theorem (Kleene, 1956): The class of languages recognized by finite-state automata is the class of regular languages.

- Concatenation
- Union
- Intersection
- Minimization
- Determinization

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# Operations on FSAs

Concatenation



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# Operations of FSAs Kleene \*



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# Operations of FSAs Union



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The Lexicon

- A lexicon is a repository of words
- Full form lexicon: every word is listed explicitly
- This is sometimes impractical
- English nominal inflection

- With respect to plural nouns are either regular or irregular
- If regular they add s
- If irregular they may have a special plural form which includes no change

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

## FSA for English Nominal Inflection



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The lexicon has

- three stem classes (reg-verb-stem, irreg-verb-stem, irreg-verb-form)
- four affix classes (-ed past, -ed participle, -ing participle, -s third-singular)

reg-verb-stem	irreg-verb-stem	irreg-past-stem	past	past-part	pres-part	3sg
walk	cut	caught	-ed	-ed	-ing	-S
fry	speak	ate				
talk	sing	eaten				
impeach		sang				



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- big, bigger, biggest
- happy, happier, happiest
- unhappy, unhappier, unhappiest
- clear, clearer, clearest, clearly, unclear, unclearly
- cool, cooler, coolest, coolly
- red, redder, reddest
- real, unreal, really

## FSA for Derivational Morphology of Adjectives



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- FSA overgenerates: it will recognise forms like unbig, smally
- We need to set up classes of roots and specify their possible suffixes such as
  - adj-root1: adjectives that can occur with un- and -ly
  - adj-root2: adjectives that cannot so occur
- Need to handle generalisations such as:
  - verbs ending in -ize can be followed by -ation (realize, realization)
  - adjectives ending in -al or -able can take suffix -ity (equal, formal)
  - or sometimes -ness (naturalness)

# Morphotactic FSA for Fragment of English Derivational Morphology



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## Handling the Words

- We can use these FSAs to solve the problem of morphological recognition.
- We do this by plugging *sub-lexicons* into the morphotactic FSAs defined earlier
- Given the right infrastructure, this kind of operation can be performed *algebraically*



- Finite-state automata are reversible: they can be used both for analysis and for generation.
- As recognisers, they can clearly be used for dictionary lookup.
- They are efficient computational devices.
  - Most algorithms on finite-state automata are linear.
  - In particular, the recognition problem is linear.
- Most phonological and morphological process of natural languages can be straightforwardly described using the operations under which regular languages are closed.
- The closure properties of regular languages naturally support modular development of finite-state grammars.