

**CS 181:  
NATURAL LANGUAGE  
PROCESSING**

*Lecture 3: Morphology & Tagging*

**KIM BRUCE  
POMONA COLLEGE  
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*Disclaimer: Slide contents borrowed from many sources on web!*

**LAST NLTK EXAMPLES**

```
>>> print nltk.corpus.treebank.parsed_sents('wsj_0001')[0]
(S
 (NP-SBJ
  (NP (NNP Pierre) (NNP Vinken))
  (, .)
  (ADJP (NP (CD 61) (NNS years)) (JJ old))
  (, .)
  (VP
   (MD will)
   (VP
    (VB join)
    (NP (DT the) (NN board))
    (PP-CLR (IN as) (NP (DT a) (JJ nonexecutive) (NN director)))
    (NP-TMP (NNP Nov.) (CD 29))))
  (, .))
```

**READING FILES**

- \* `f = open('afile', 'rU')` # ignores diff in `\n`
- \* `f.readline()` # returns one line (including `\n`) at a time.
- \* `contents = f.read()` # reads whole file into string

**MORPHOLOGY**

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- \* Study of sub-word units of meaning
  - \* Ex: disconnect - "not" + "attach"
- \* Construct plurals:
  - \* regular: add s
  - \* word ends in y: change y to i and add es
  - \* word ends in x or ch: add es
  - \* ...
- \* Breaking word ("churches") into morphemes "church" and "es" called morphological parsing

**MORE MORPHOLOGY**

- \* Morpheme: minimal meaning-bearing unit
  - \* Stem: main morpheme, e.g., church
  - \* Affixes: add "additional" meanings, e.g. es, un, anti, ize, ization, ...
  - \* not always concatenative - add in middle or use other templates
- \* Inflection: stem + morpheme in same class
  - \* usually for agreement
- \* Derivation: stem + morpheme in diff class
  - \* e.g., add "ly" or "ize"
- \* Lemma: Set of lexical forms with same stem.

## REGULAR VERB FORMS

Morphological classes				
stem	walk	merge	try	map
-s form	walks	merges	tries	maps
-ing participle	walking	merging	trying	mapping
Past form	walked	merged	tried	mapped

## IRREGULAR VERBS

Morphological classes			
stem	eat	catch	cut
-s form	eats	catches	cuts
-ing participle	eating	catching	cutting
past form	ate	caught	cut
-ed/-en participle	eaten	caught	cut

## TWO GOALS

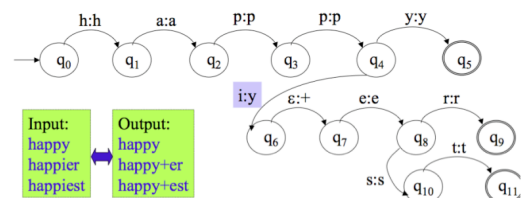
- Recognize word as legal or not, and return lexical form: lemma + tags:
  - dogs  $\Rightarrow$  dog + N + PL
  - children  $\Rightarrow$  child + N + PL
- Generate correct surface form from lemma plus tags (*reverse of above*)

## FINITE-STATE TRANSDUCCERS

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- Generalize FSA's to generate output
- Finite state transducer: 2 tape automaton that generates output on second tape while reading input on first.
- Ideally, can run either direction
- Want to cascade simple transformations into more complex ones.

## EXAMPLE TRANSDUCER

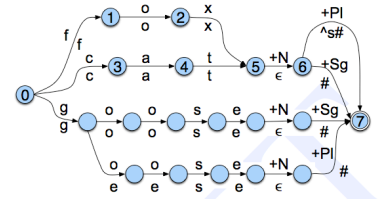


- Translates surface form of word to morphemes.
- Lexicon can be encoded as a FST

## TRANSLATING BETWEEN FORMS

- Use “^” as morpheme boundary, “#” as word boundary.
- Three forms:
  - Lexical: church+N+PL
  - Intermediate: church^s#
  - Surface: churches#

## EXAMPLE FROM TEXT

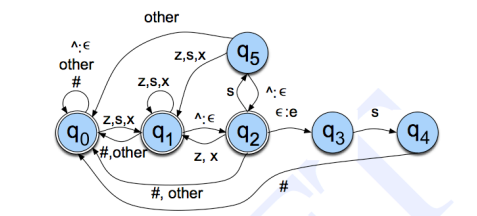


Top is lexical form  
 Bottom is corresponding intermediate form  
*Not deterministic! Not nec. equiv. to DFST.  
 May have to search!*

## RULES FOR PLURALS

- Add an “e” after “s”, “z”, “x”, “ch”, or “sh” before adding “-s”
- “y” changes to “ie” before “-s”

## CONVERTING PLURALS



Intermediate to Surface

## CASCADE FST'S

- Compose Lexical  $\Leftrightarrow$  Intermediate and Intermediate  $\Leftrightarrow$  Surface FST's to get Lexical  $\Leftrightarrow$  Surface
- Can also intersect FST's
- Ambiguity a problem: Is “dogs”
  - dog + N + Pl or
  - dog + V + 3Sg
- Return both and decide later based on contextual information

## PORTER STEMMER

- First approach depended on lexicon plus rules.
- Approaches just based on rules.
- Stemmers return base form of word.
- Porter (1980) is a good one, though improvements possible.

## PORTER STEMMER

- Rules depend on “measure” of the stem:
  - consonant is any but a, e, i, o, u, or y preceded by consonant.
  - C represents one or more consonants
  - V represents one or more vowels
  - Write words uniquely as [C](VC)<sup>m</sup>[V] where [...] means optional.
  - Measure is m.
- Examples: by (0), tree (0), trees(1), private(2), trouble(1), troubles(2)
- Other conditions, e.g., (\*v\*) = contains vowel

## PORTER STEMMER RULES

- Seven sets of rewrite rules of form (cond) S1 ⇒ S2 to get stem:
  - Plural nouns & 3Sg V:
    - SSES ⇒ SS     *asses* ⇒ *ass*
    - IES ⇒ I        *ponies* ⇒ *poni*
    - SS ⇒ SS        *asses* ⇒ *asses*
    - S ⇒ ε            *dogs* ⇒ *dog*
  - a. Verbal Past tense & Progressive forms
    - (m > 1) EED ⇒ EE     *feed* ⇒ *feed*, *agreed* ⇒ *agree*
    - (\*v\*) ED ⇒ ε         *planted* ⇒ *plant*, *fed* ⇒ *fed*
    - (\*v\*) ING ⇒ ε         *telling* ⇒ *tell*, *ring* ⇒ *ring*

## PORTER STEMMER RULES

- Seven sets of rewrite rules not always successful
  - organization* ⇒ *organ*
  - doing* ⇒ *doe*
  - analysis* ⇒ *analysi*
  - matrices* ⇒ *matric*
  - matrix* ⇒ *matrix*

## STEMMER IN NLTK

```
import nltk

stemmer = nltk.PorterStemmer()

words = ['assess', 'ass', 'assesses', 'analyze', 'analysis']
stems = []
for word in words:
    stem_word = stemmer.stem(word)
    stems.append(stem_word)

print sorted(set(stems))
```

ANY QUESTIONS?