

Agenda

- ▶ Recap
- ▶ Words
- ▶ Morphology: Internal structure of words
- ▶ Parts of speech

Byte-pair encoding

- ▶ Originally proposed for lossless data compression

aaabdaaabc

aaabdaaabc

Replace aa with Z

ZabdZabc

Replace ab with Y

ZabdZabc

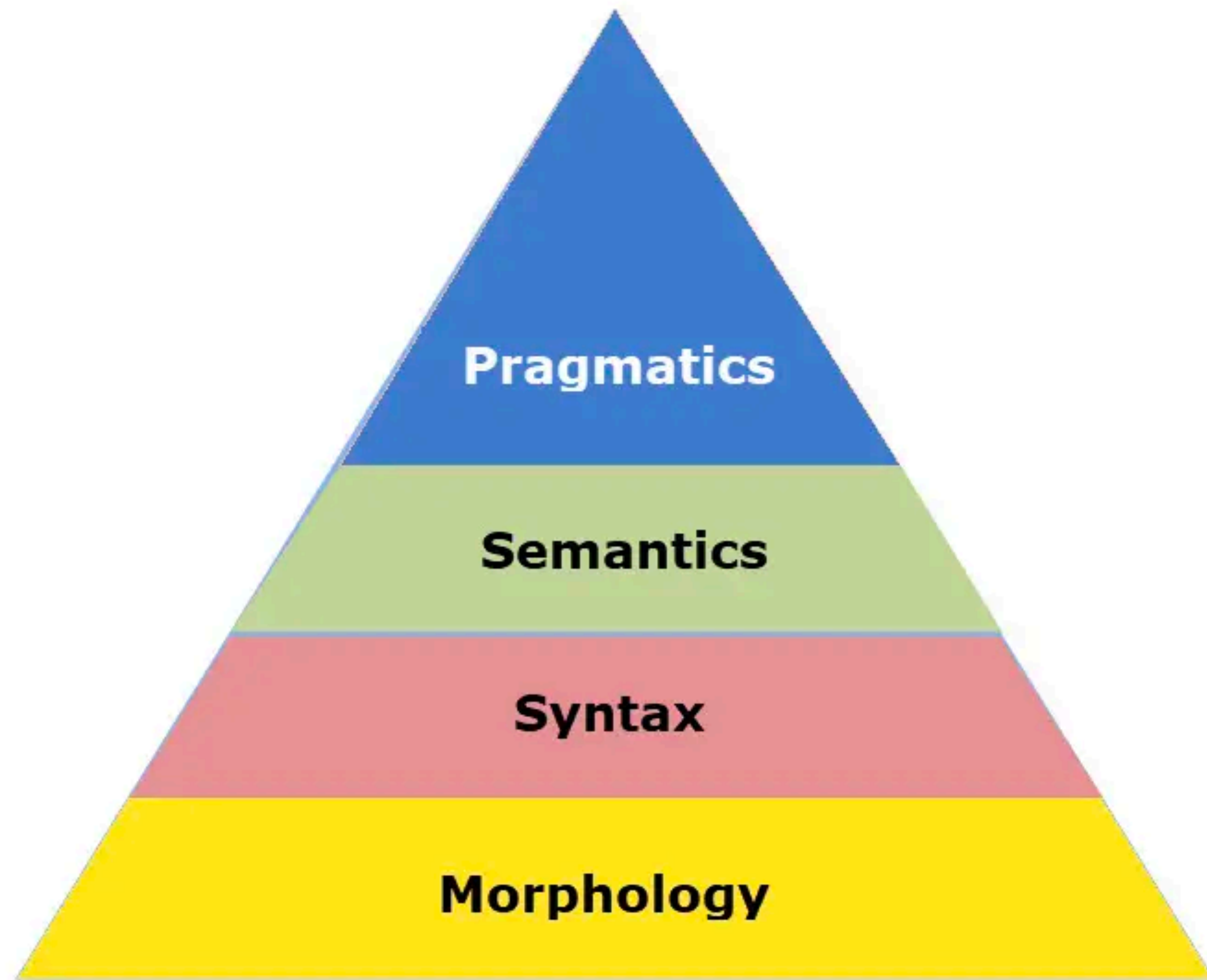
Replace ab with Y

ZYdZYac

...

Edit distance table

	M	O	N	K	E	Y
M	0	1	2	3	4	5
O	1	0	1	2	3	4
N	2	1	0	1	2	3
E	3	2	1	2	1	2
Y	4	3	2	3	2	1



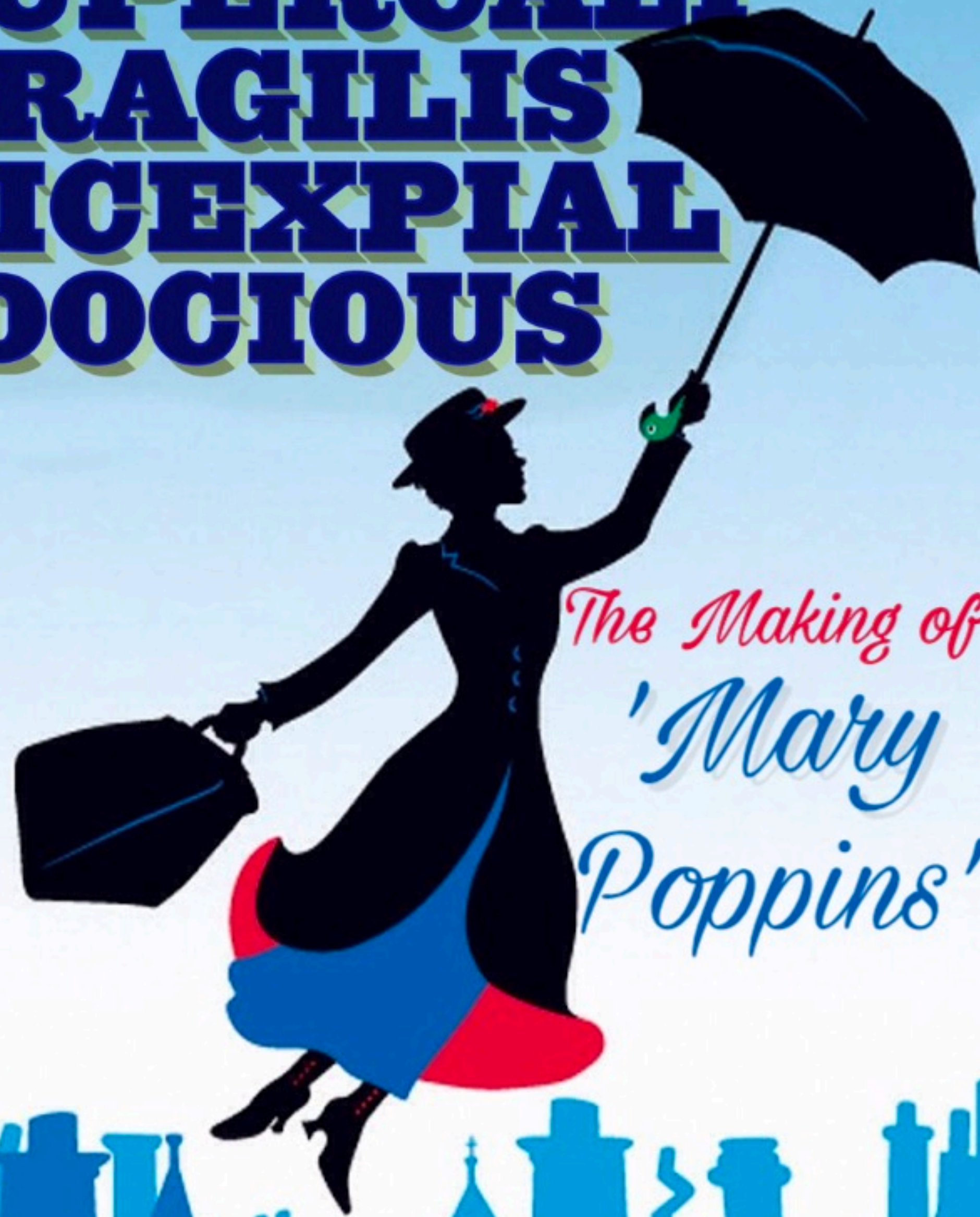
Natural Language Processing Pyramid

Word

- ▶ Words are at the interface between phonology, syntax and semantics
- ▶ Words are not atoms
 - They have internal structure

supercalifragilisticexpialidocious

**SUPERCALI
FRAGILIS
TICEXPIAL
IDOCIOUS**



*The Making of
'Mary
Poppins'*

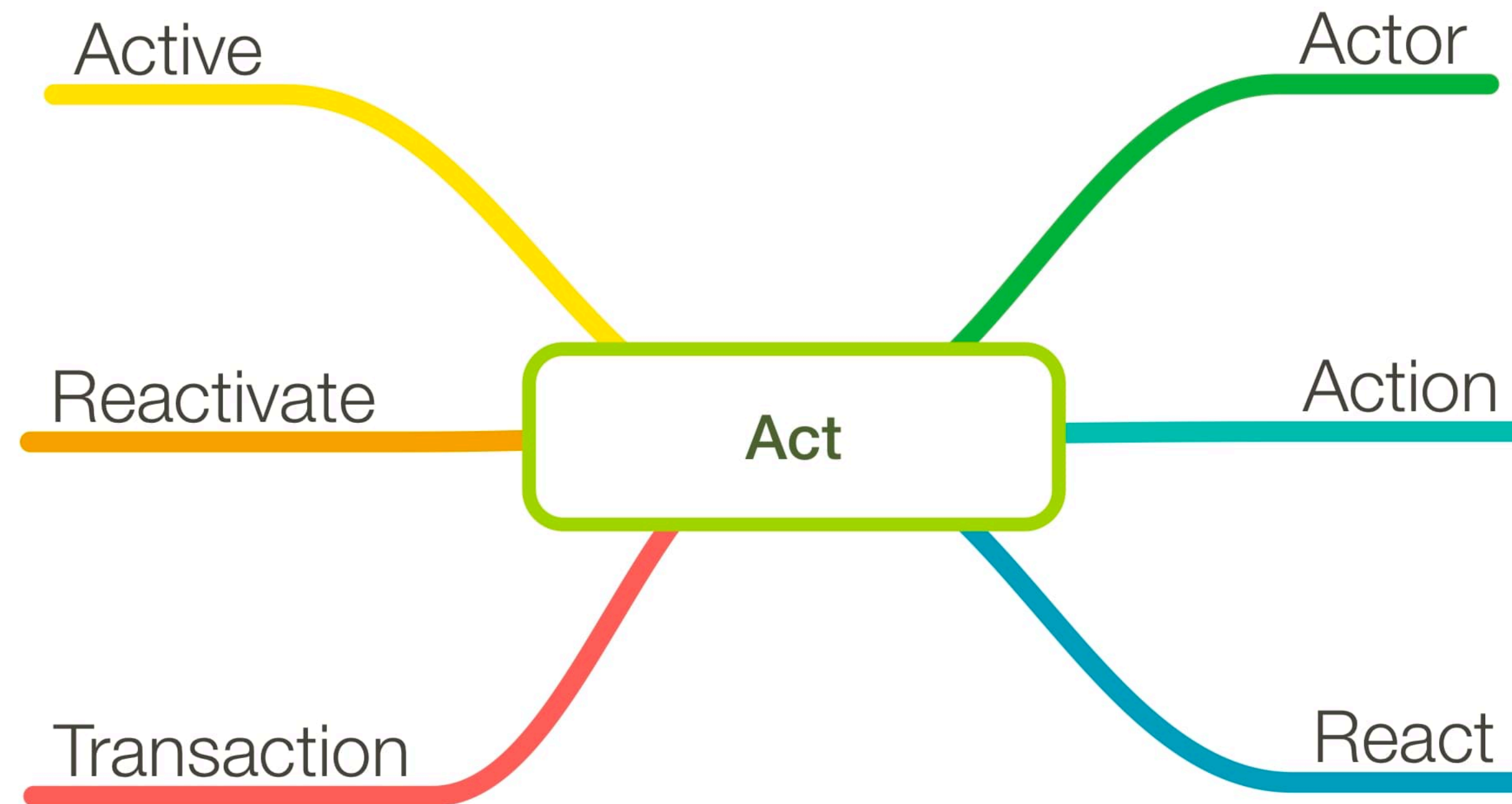
Linguistic morphology

- ▶ The study of how morphemes join together to form words
- ▶ Morphemes are the *minimal* units of linguistic form and *meaning*

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Why do we need to learn morphology?

- ▶ The creation of new words
- ▶ The modification of existing words. We create new words out of old ones all the time



Differences between Words and Morphemes

- ▶ Another difference between words and morphemes is that between two words, we can usually insert some other words, while between two morphemes we can't
 - She has arrive-d.
 - She has **already** arrive-d.
 - She has arrive-d **already**.
 - *She has arrive-**already**-d.

Differences between Words and Morphemes

- ▶ Whitespace is not always a good test for the word/morpheme distinction in English. Compound nouns are often spelled with whitespace between their components, yet they are a single word
 - Picture frame
 - Swim team

Chinese example

- ▶ In classic Chinese, usually each character is a word and also a morpheme
- ▶ Most words in modern Standard Chinese (i.e. Mandarin) are compounds and most roots are bound

难易相成

难和易是相互转化的

Category

1 morpheme

Neither cat nor gory has nothing to do with the meaning of category in English

Categorize

2 morphemes
Category + ize

Categorized

3 morphemes
Category + ize + ed

Overestimating

3 morphemes

over + estimate + ing

Word has structures

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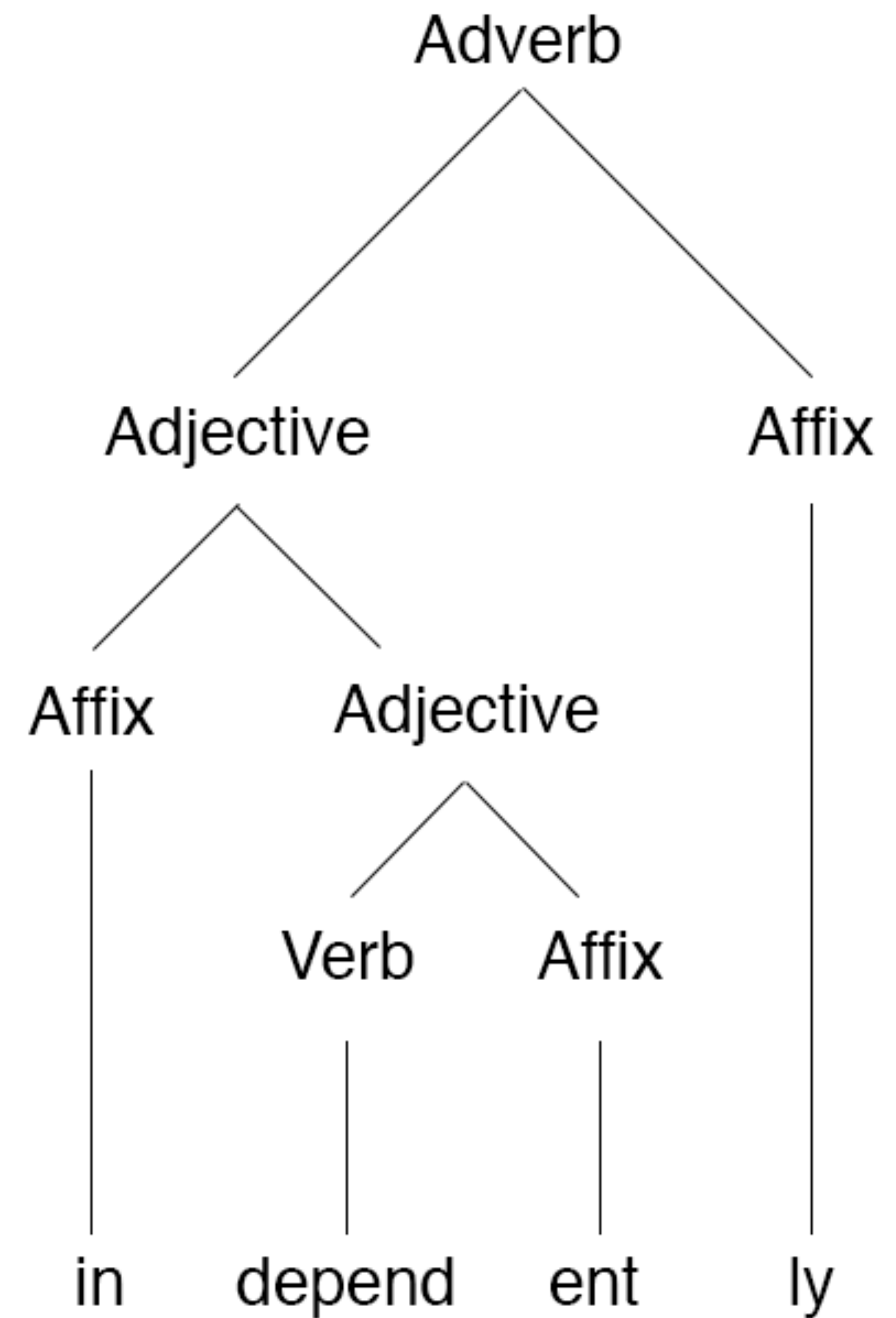
supercalifragilisticexpialidocious

super- "above", cali- "beauty", fragilistic- "delicate", expiali- "to atone", and -docious "educable",

Morpheme: Root

- ▶ Root
 - The central morphemes in words, which carry the main meaning

*In***de***pend***ent***ly*



Morpheme: Affixes

► Affixes

- Prefixes

- de-pend, in-correct

- Suffixes

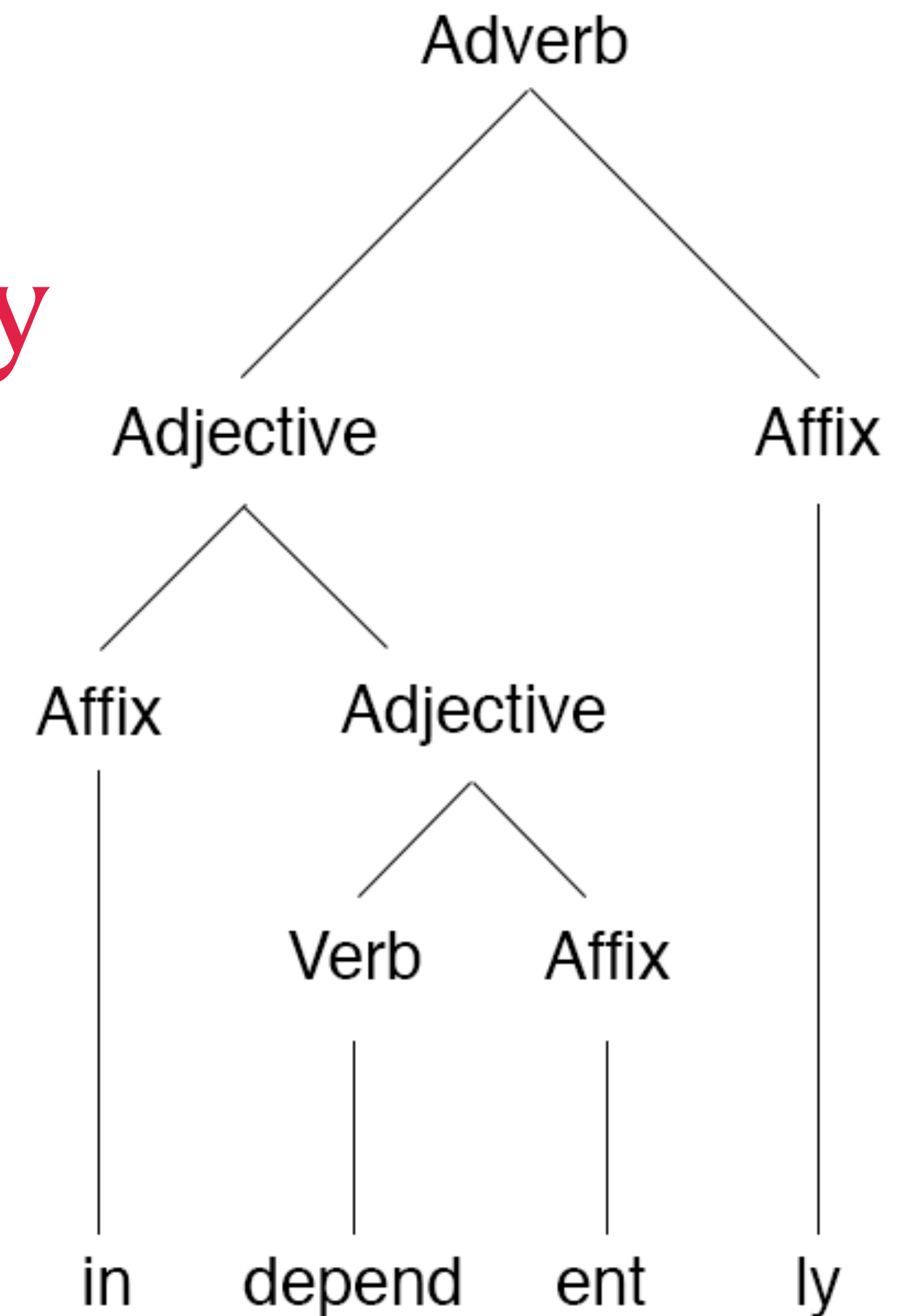
- depend-ent, love-ly

- Infixes (not common)

- edu-ma-cation

- Circumfixes

Independently



Edu-ma-cation

Used in a sarcastic sense, or in dialogue, suggesting lack of education on the part of the speaker

Nonconcatenative morphology

- ▶ Umlaut
 - Foot : feet
 - Tooth : teeth
- ▶ Ablaut
 - Sing, sang, sung
- ▶ Root-and-pattern or templatic morphology
 - Common in Arabic, Hebrew, and other Afroasiatic languages
 - Roots made of consonants, into which vowels are shoved
- ▶ Infixation
 - Gr-um-adwet

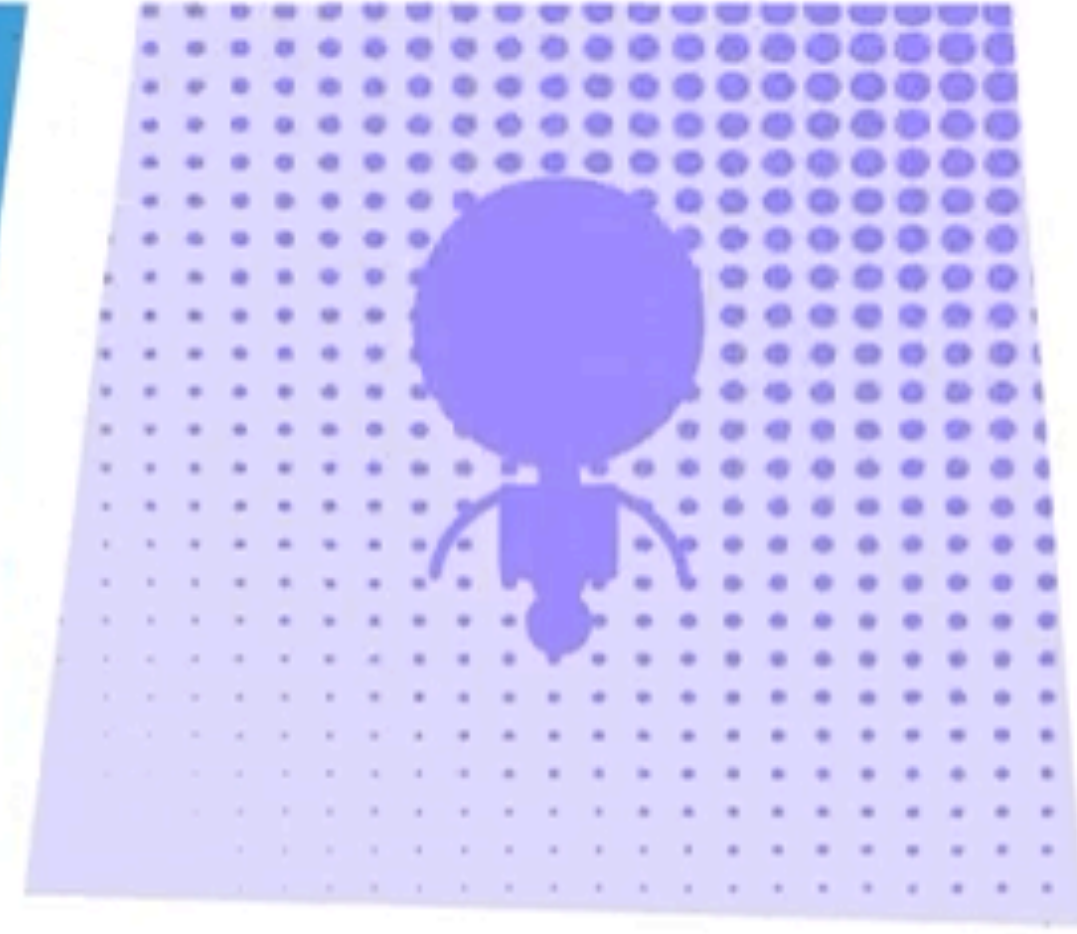
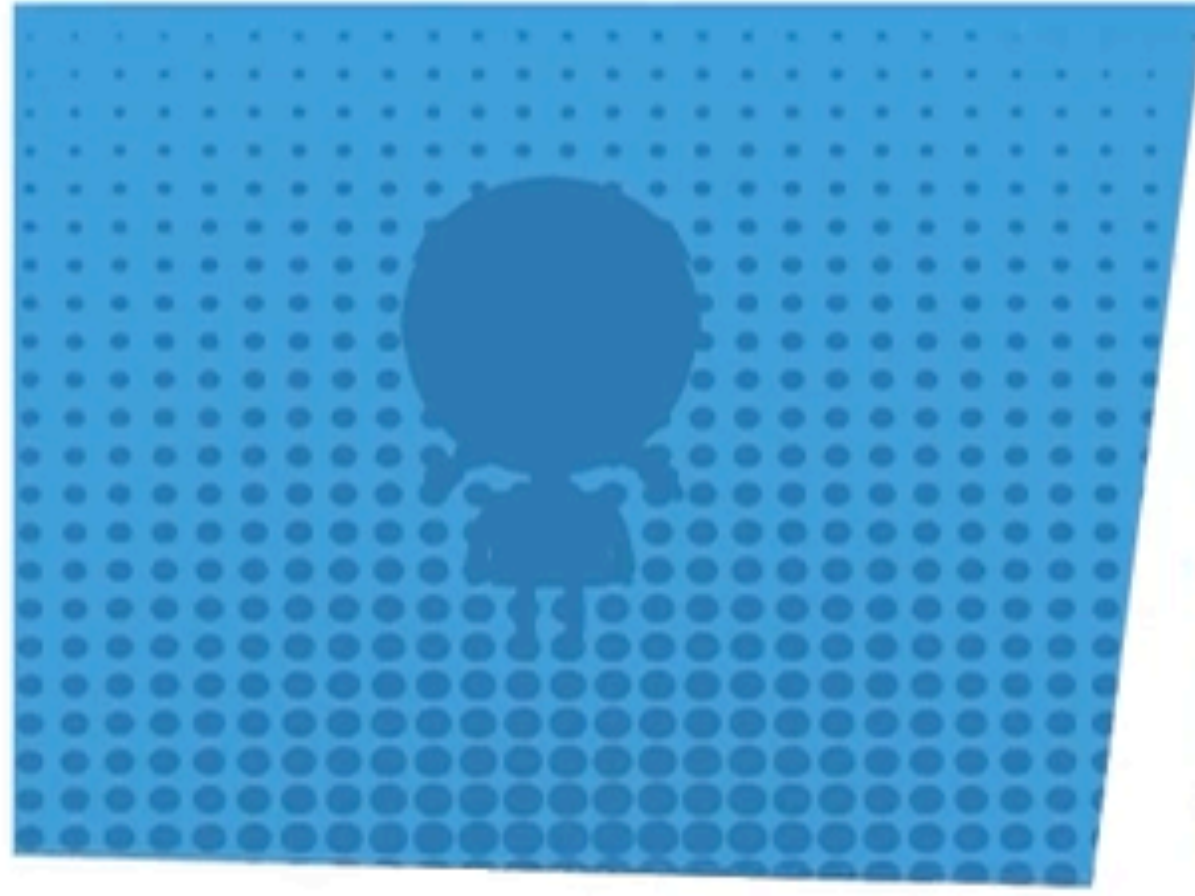
Functional differences in morphology

- ▶ Inflectional morphology
 - Adds information to a word consistent with its context within a sentence
 - Student -> students
 - Sleep -> sleeping
 - Listen -> listening
- ▶ Derivational morphology
 - Creates new words with new meanings (and often with new parts of speech)
 - Sing -> singer
 - Beauty -> beautiful

Weirdness of morphology

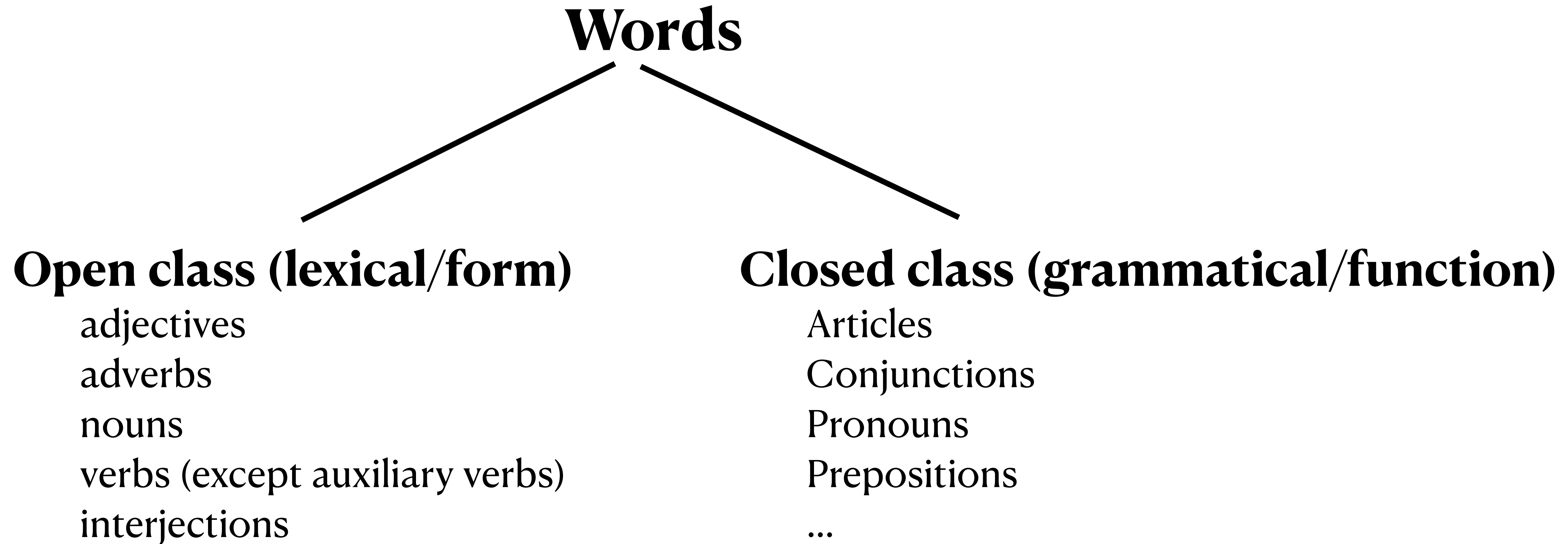
- ▶ Anything that a language does with morphology, it usually can also do more straightforwardly with syntax.
- ▶ Example: Plural marking
 - Dog -> dog-s
 - more than one dog

Parts of speech



**Parts of Speech League, Parts of Speech
League, Parts of Speech League!**

Two classes of words



Two classes of words: Open class

- ▶ Open class
 - Usually content words: Nouns, Verbs, Adjectives, Adverbs
 - Plus interjections: oh, ouch, uh-huh, ...
 - New nouns and verbs like iPhone

Two classes of words: Closed class

- ▶ Closed class
 - Relatively fixed membership
 - Usually function words: short, frequent words with grammatical function
 - Determiners: a, an, the
 - Pronouns: she, he, I
 - Prepositions: on, under, over, ...

Open class ("content") words

Nouns

Proper

Janet
Italy

Common

cat, cats
mango

Verbs

Main

eat
went

Auxiliary

can
had

Adjectives

old green tasty

Adverbs

slowly yesterday

Numbers

122,312
one

Interjections *Ow hello*

... more

Closed class ("function")

Determiners *the some*

Conjunctions *and or*

Pronouns *they its*

Prepositions *to with*

Particles *off up*

... more

Words are ambiguous

- ▶ A word can have more than one possible part-of-speech
 - She is reading a *book* about airplane
 - She will *book* a flight for you

Part-of-speech tagging is a disambiguation process

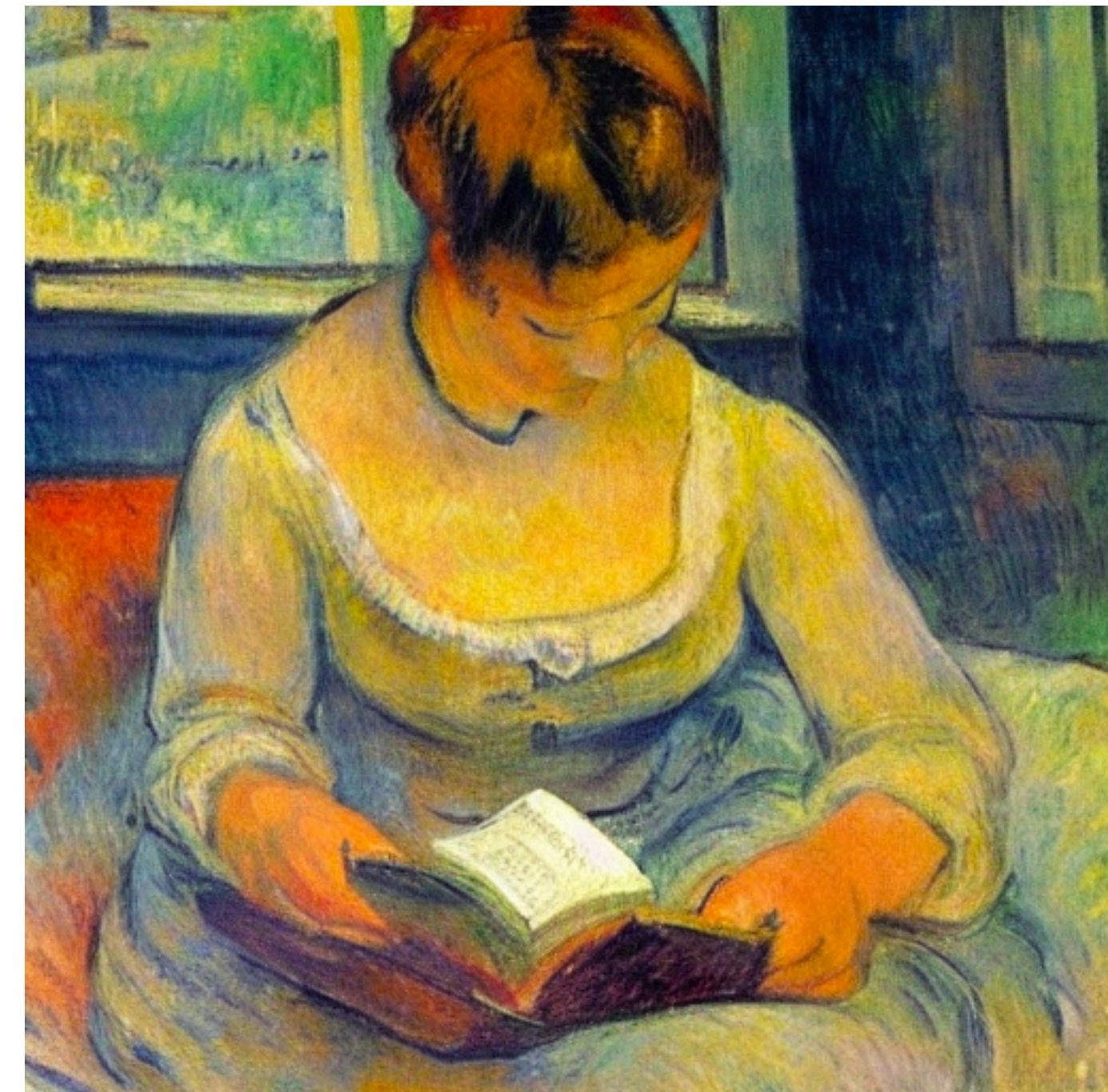
Verb or Noun?



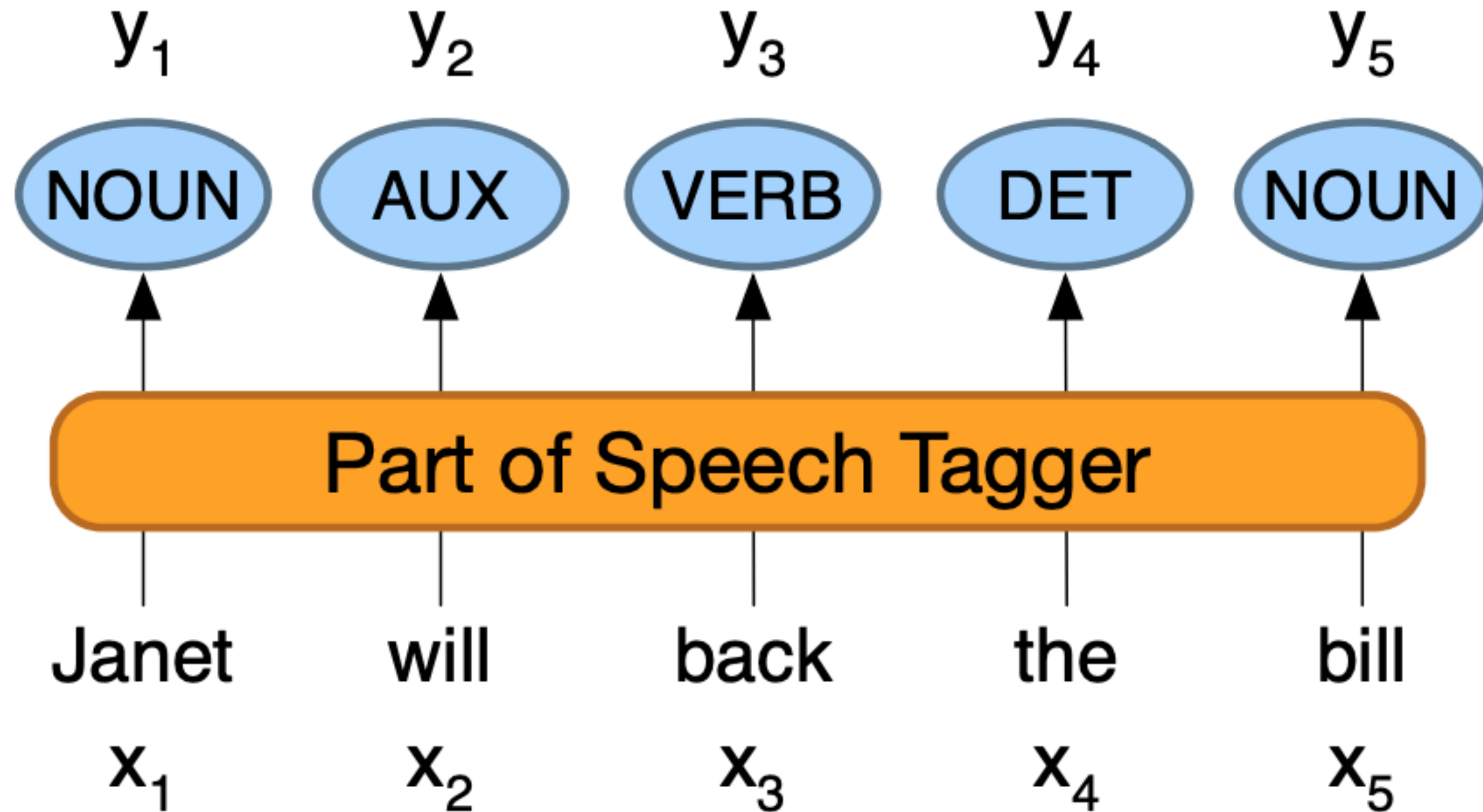
Verb or Noun?



She is **reading** a book about **Reading**



POS tagging as a sequence labeling task



Summary

- ▶ Words are at the interface between phonology, syntax and semantics
- ▶ Words have internal structures, and morphemes are the *minimal* units of linguistic form and *meaning*
- ▶ A word can have more than one possible part-of-speech
 - Words can be grouped into open and closed classes
 - Part-of-speech tagging is a disambiguation process

Readings

- ▶ Chapter 8: Sequence Labeling for Parts of Speech and Named Entities
 - <https://web.stanford.edu/~jurafsky/slp3/>