

CS 378 Lecture 8

Today

- Bias in embeddings
- Part-of-speech intro
- Sequence tagging
- Tagging with classifiers



Announcements [prans in zoom]

- A1
- A2
- Survey:

Good: rewatchable lectures, exercises/breakouts, notes

Not so good: ① Working in pairs on HW - please do!

- ② More exercises
- ③ Bigger breakouts / more engagement
- ④ More context / big picture
- ⑤ Reading guidance - holding

Recap Skip-gram

Input: corpus of text

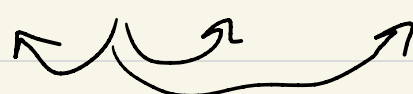
Corpus $\Rightarrow (x, y)$ pairs which are $\leq k$ words apart (k = window size)

$$P(\text{context} = y | \text{word} = x) = \frac{e^{\bar{v}_x \cdot \bar{c}_y}}{\sum_{y' \in V} e^{\bar{v}_x \cdot \bar{c}_{y'}}}$$

Maximize log likelihood of data \Rightarrow get useful \bar{v}_s, \bar{c}_s


Use \bar{v}, \bar{c} , or $\bar{v} + \bar{c}$ in downstream tasks

the fish swam quickly $k=2$



Where we are

Classification: $\underset{y}{\operatorname{argmax}} \bar{w}_y^T \underbrace{f(\bar{x})}_{\text{NN, BoW}}$

 $\overset{\text{sent}}{\text{doc}} \Rightarrow \text{label}$

$\sim \text{sent} \Rightarrow \text{label for each word in that sentence}$

Part-of-speech tagging

① Structurally different problem

$\bar{x} \rightarrow y$

$x_1, \dots, x_n \rightarrow y_1, \dots, y_n$ tag for each word

② Syntax

Parts of speech

Text to speech: record

Info. extraction: arms V or N?

POS Tags

Open-class: there
can be new words here

Nouns: Proper: IBM,
Common: cat

Verbs: see, registered

Adjs: yellow

Adv: swiftly

Closed-class: fixed
set

Determiners: the, a
(articles)

Some

DT + N \Rightarrow NP

Conjunctions: and/or

Pronouns

Prepositions: up, on, ...

Particles: made up

Auxiliaries, modals: Aux: had [V]
Modals: could/would/should

"rest" Penn Treebank

fed NNP proper noun I fed her...
VBD past tense verb
VBN participial I had fed...

raises NNS plural noun
VBZ 3rd person present verb

interest NN noun
VBP I interest you
VB infinitive: I want to interest you

rates NNS
VBZ

0.5 CD cardinal

percent NN

correct

rates are
a lively thing
that get
interested

Sequence Tagging

Input: $\bar{X} = (x_1, \dots, x_n)$ $x_i \in V$ words

Output: $\bar{Y} = (y_1, \dots, y_n)$ $y_i \in \mathcal{Y}$ tags

Structured classification: output has structure

Start: use classifiers

$P(y_i = y \mid \bar{X})$ use LR, ... to assign tag y to word i in sentence \bar{X}

Next: Hidden Markov Models