

LING/C SC 581:

Advanced Computational Linguistics

Lecture 10

Administrivia

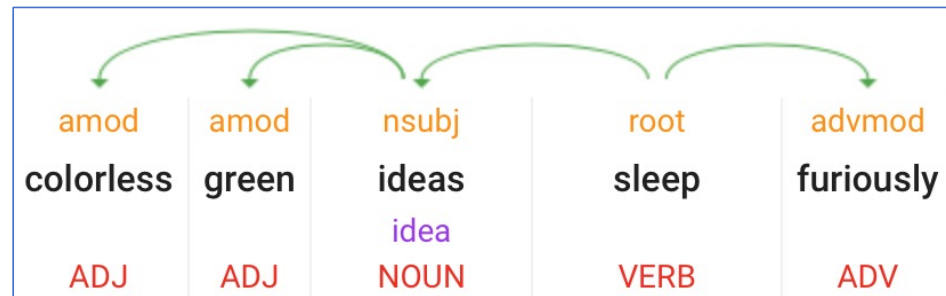
- Lectures 6-9 are canceled. Sorry.
- Let's reboot the course with some syntactic analysis ...
- Quick Homework 4 (*do it before next time*)

Universal Dependencies

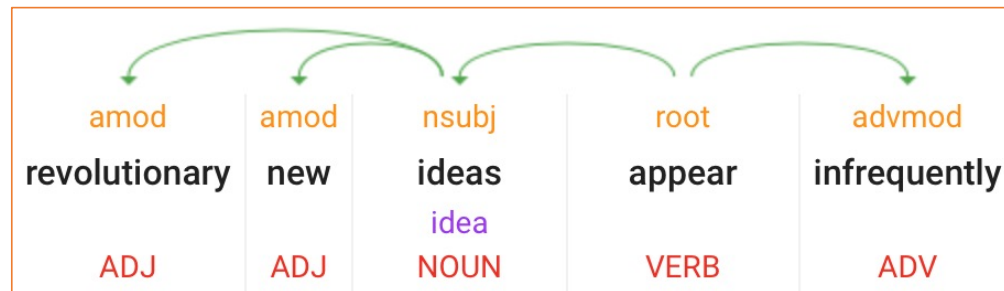
- We have seen some examples from 538 last semester (*see also next slide*).
- Stanford Dependencies (SD) (de Marneffe and Manning, 2008, rev. 2016)
 - https://downloads.cs.stanford.edu/nlp/software/dependencies_manual.pdf
 - still used by Google Natural Language
- Universal Stanford Dependencies (de Marneffe *et al.*, 2014)
 - https://nlp.stanford.edu/pubs/USD_LREC14_paper_camera_ready.pdf
- Universal Dependencies (UD) v2
 - <https://universaldependencies.org/u/dep/index.html>
 - "Universal Dependencies (UD) is a project that is developing cross-linguistically consistent treebank annotation for many languages, with the goal of facilitating **multilingual parser development**, cross-lingual learning, and parsing research from a language typology perspective."

Example

- pg145-146 in *LSLT* (Chomsky 1955/1975)
- <https://cloud.google.com/natural-language/>



- sequence ADJ ADJ NOUN VERB ADV is grammatical



Example

- There's no notion of **grammaticalness**, *Google Natural Language* doesn't rate its inputs (*produces top parse only*)

11 *colorless green ideas sleep furiously*

12 *furiously sleep ideas green colorless*

can you parse
this?

advmod	root	dobj	amod	acompl
furiously	sleep	ideas	green	colorless
		idea		
ADV	VERB	NOUN	ADJ	ADJ

BTW:
acompl not in UD

Example

(de Marneffe *et al.*, 2014)

SD v2.0.0	SD v3.3.0	GSD	TSD	USD	Notes
nsubj	nsubj	nsubj	nsubj	nsubj	✓
csubj	csubj	csubj	csubj	csubj	✓
nsubjpass	nsubjpass	nsubjpass	nsubjpass	nsubjpass	✓
csubjpass	csubjpass	csubjpass	csubjpass	csubjpass	✓
dobj	dobj	dobj	dobj	dobj	✓
iobj	iobj	iobj	iobj	iobj	✓ (TSD also has <i>gobj</i> for genitive object)
ccomp	ccomp	ccomp	ccomp	ccomp	USD & TSD define as clause with internal subject, not finite
xcomp	xcomp	xcomp	xcomp	xcomp	USD & TSD define as clause with external subject, not nonfinite
acomp	acomp	acomp	acomp	–	<i>acomp</i> can be generalized into <i>xcomp</i>
attr	–	attr	–	–	<i>attr</i> removed: <i>wh-</i> is head or <i>xcomp</i> (with copula head option)

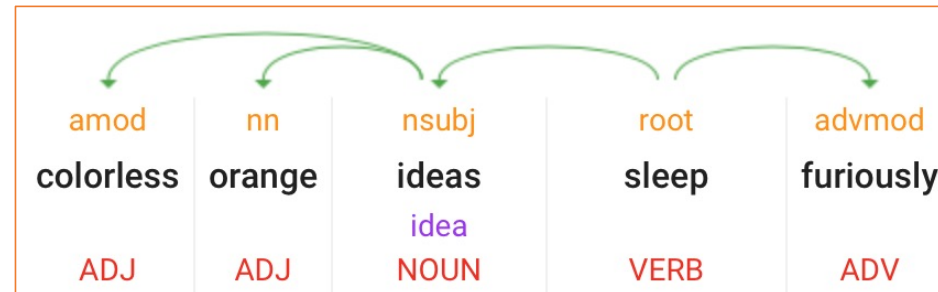
xcomp: open clausal complement

Example

- Chomsky (p.c.): (11) is no longer an ideal example to use (*as it has been well-discussed over the last half century or so*), suggesting, instead, that substituting *orange* for *green* would reset the bigram statistics

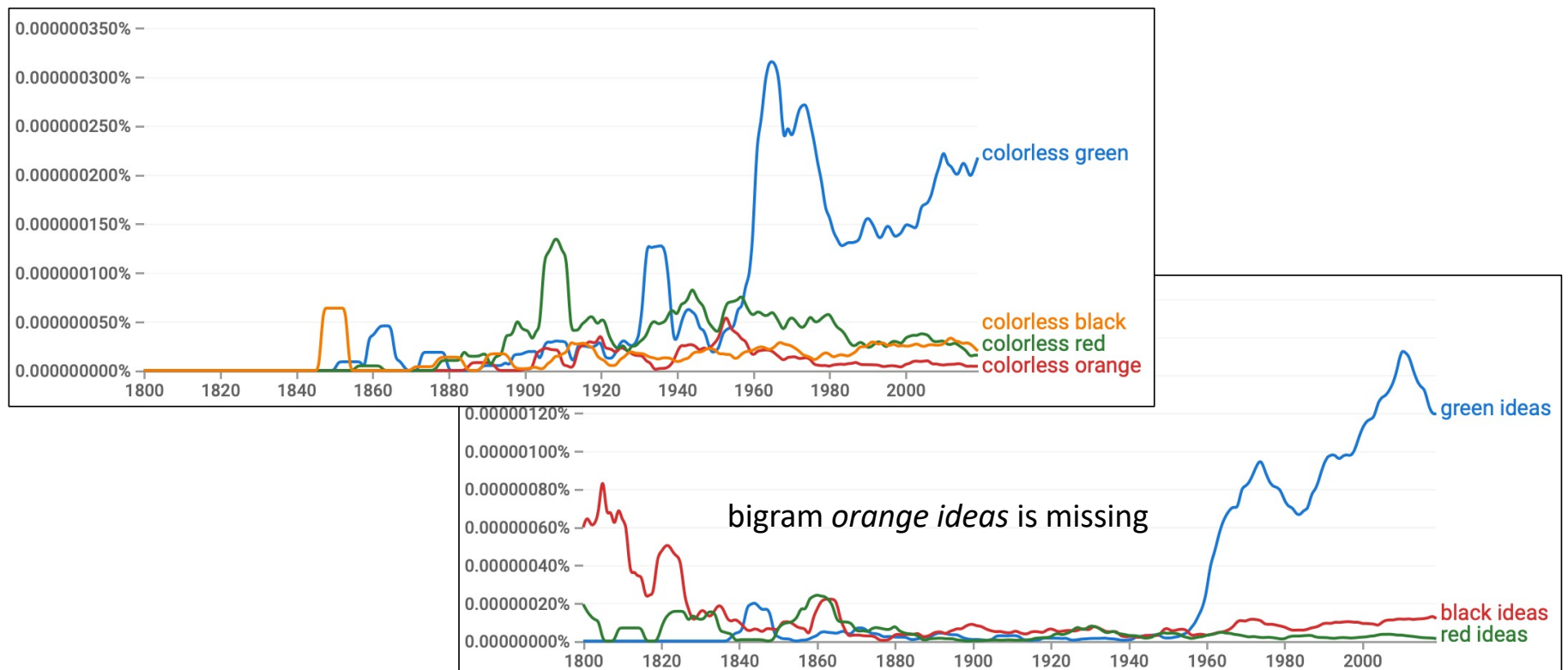
11 *colorless green ideas sleep furiously*

12 *furiously sleep ideas green colorless*



nn	nn	compmod	nn	compound	Generalize nn to light verbs, etc.; X ⁰ compounding not modification
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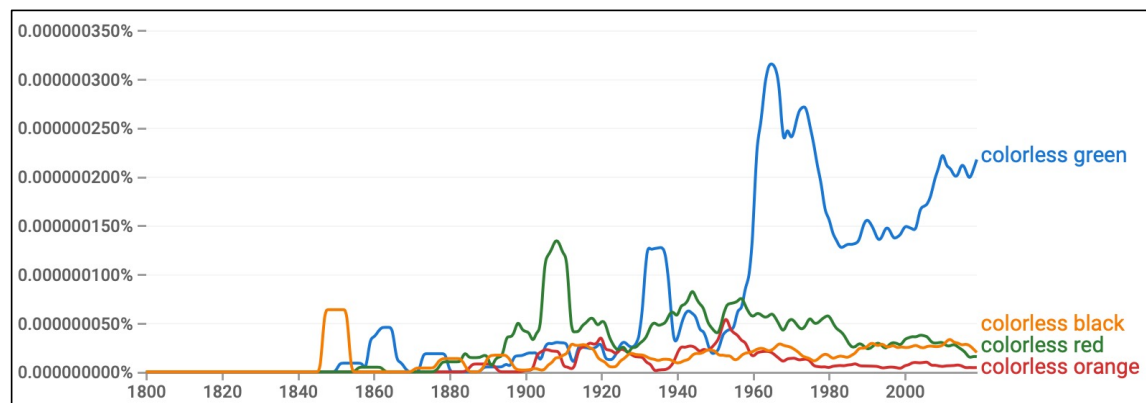
Example



Example

amod	amod	nsubj	root	advmod
colorless	black	ideas	sleep	furiously
ADJ	ADJ	idea NOUN	VERB	ADV

amod	amod	nsubj	root	advmod
colorless	red	ideas	sleep	furiously
ADJ	ADJ	idea NOUN	VERB	ADV

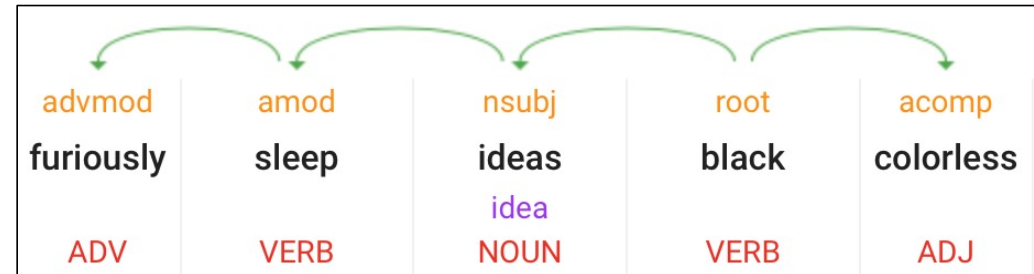
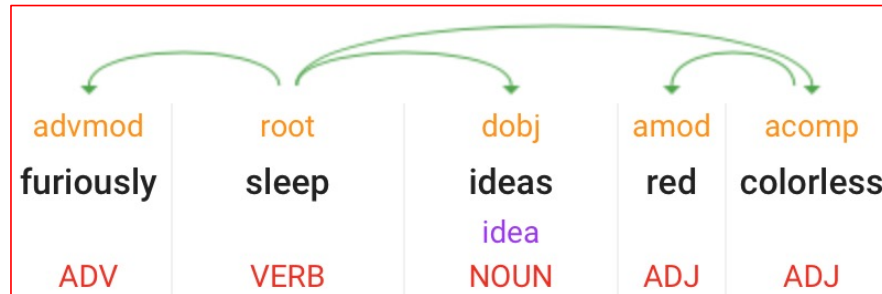
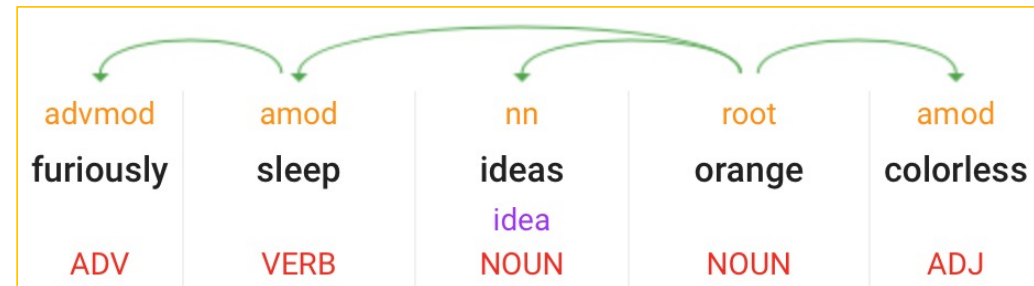
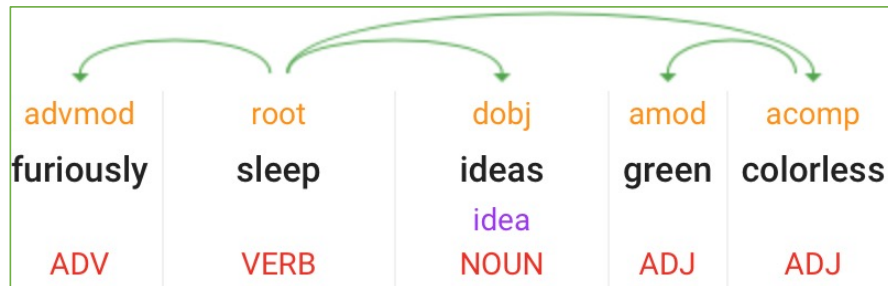


Example

11 *colorless green ideas sleep furiously*

12 *furiously sleep ideas green colorless*

can you parse this?



Example

- We get 3 different sequences:
 1. ADV VERB NOUN ADJ ADJ
 2. ADV VERB NOUN NOUN ADJ
 3. ADV VERB NOUN VERB ADJ
- Question: *are these grammatical sequences?*
 - **Quick Homework 4** (*do it before next time*)
 - Come up with grammatical examples of these three sequences (in English), or explain why you think they're not.
 - Email to me (*usual rules*)

Universal Dependencies

- Publicly available dependency treebanks
- Produced by parsers or by human experts or some combination thereof?
- Lots of training data for machine learning

LANGUAGES:



Afrikaans

9



Akkadian

10



Akuntsu

3



Albanian

4



Amharic

9



Ancient Greek

18



Apirina

3



Arabic

18



Armenian

10



Assyrian

6



Bambara

7



Basque

9



Beja

2



Belarusian

9



Bengali

1



Bhojpuri

5



Breton

9



Bulgarian

10



Buryat

9



Cantonese

9



Catalan

9



Chinese

38



Chukchi

3



Classical Chinese

6



Coptic

9



Croatian

9



Czech

58



Danish

9



Dutch

18



English

52



Erzya

7



Estonian

16



Faroese

12



Finnish

28



French

48



Frisian-Dutch code switching

2



Galician

17



German

29



Gothic

9



Greek

9



Guajajara

2



Hebrew

9



Hindi

17



Hungarian

9



Icelandic

9



Indonesian

20



Irish

11



Italian

46



Japanese

27



Javanese

1



Kaapor

2



Kangri

2



Karelian

6



Karo

1



Kazakh

9



Khunsari

3



Kiche

2



Komi Permyak

5



Komi Zyrjan

17



Korean

25



Kurdish

9



Latin

35



Latvian

16



Ligurian

1



Lithuanian

15



Livvi

5



Low Saxon

2



Makurap

2



Maltese

7



Manx

3



Marathi

9



Mbya Guaraní

6



Moksha

5



Mundurucu

3



Naija

9



Nayini

3



Neapolitan

1



North Sámi

9



Norwegian

25



Old Church Slavonic

9



Old French

9



Old Russian

12



Old Turkish

3



Persian

13



Polish

24



Portuguese

26



Romanian

25



Russian

33



Sanskrit

13



Scottish

5



Serbian

9



Skolt Sámi

5



Slovak

9



Slovenian

19



Soi

3



South Levantine Arabic

3



Spanish

25



Swedish

26



Swedish Sign Language

9



Swiss German

5



Tagalog

13



Tamil

13



Tatar

1



Telugu

9



Thai

9



Tupinamba

3



Turkish

35



Turkish-German code switching

3



Ukrainian

9



Upper Sorbian

9



Urdu

9



Uyghur

9



Vietnamese

9



Warlpiri

9



Welsh

6



Western Armenian

2



Wolof

6



Xibe

1



Yakut

1



Yoruba

9



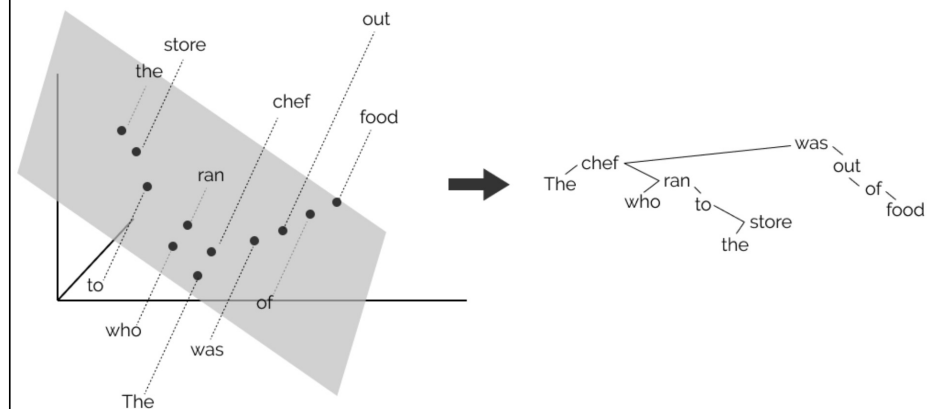
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Structural Probes

- Paper (Hewitt & Manning, 2019)
 - <https://nlp.stanford.edu/pubs/hewitt2019structural.pdf>
- Blog entry:
 - <https://nlp.stanford.edu/~johnhew//structural-probe.html>
- **Idea:**
 1. use contextual word embeddings (ELMo or BERT)
 2. No dependency treebank
 3. *"We'll present a method for finding tree structures in these vector spaces, and show the surprising extent to which ELMo and BERT encode human-like parse trees."*

Finding Syntax with Structural Probes



If you simply ask a deep neural network to learn what typical English sentences look like by reading all of Wikipedia, what does it learn about the English language?

Structural Probes

- You'll install this code on your computer
 - Python 3 required, plus some modules
 - <https://github.com/john-hewitt/structural-probes>
- We'll discuss the installation and Homework 5 next lecture.
- Example:

```
"The chef that went to the stores was out of food" | python structural-probes/run_demo.py
example/demo-bert.yaml
Constructing new results directory at example/results/BERT-disk-demo-2022-1-28-14-40-51-
39486/
The pre-trained model you are loading is a cased model but you have not set
`do_lower_case` to False. We are setting `do_lower_case=False` for you but you may want
to check this behavior.
100%|████████████████████████████████████████| 213450/213450 [00:00<00:00, 2492466.95B/s]
100%|████████████████████████████████████████| 1242874899/1242874899 [08:11<00:00, 2530392.20B/s]
Constructing TwoWordPSDProbe
Constructing OneWordPSDProbe
[demoing]: 1it [00:00, 1.26it/s]
```

Structural Probes

colorless green ideas sleep furiously

furiously sleep ideas green colorless