LING/C SC 581:

Advanced Computational Linguistics

Lecture 14

Today's Topics

- Homework 6 Review
- Stanford CoreNLP
 - online use (graphical output)
 - use with programs (textual output)
- Stanford Stanza
 - Deep Learning parser etc., but also can provide access to CoreNLP
 - interfacing with Python

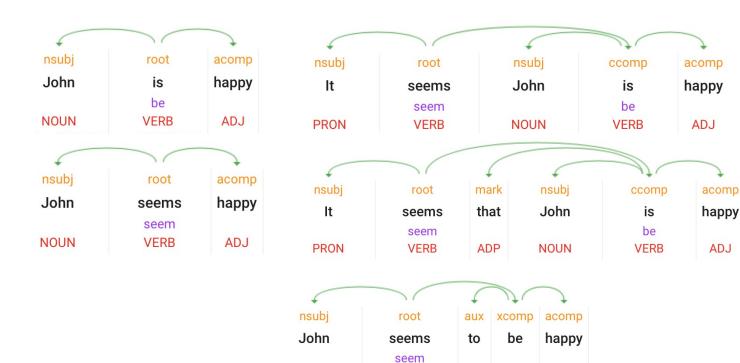
Homework 6 review

Question 1

- Raising verb seems:
 - John is happy
 - John seems happy
 - It seems John is happy
 - It seems that John is happy
 - John seems to be happy

 Assume the SP unlabeled relations are labeled with the most likely dependency labels

Homework 6: Question 1 Review



VERB

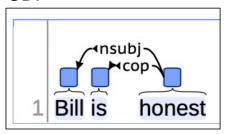
VERB

PRT

ADJ

NOUN





A cop (copula) is the relation of a function word used to link a subject to a nonverbal predicate

Homework 6: Question 1 Review

John is happy

John seems happy

It seems John is happy

It seems that John is happy

John seems to be happy

- Differences:
 - John link happy vs. is
 - none
 - seems link happy vs. is
 - seems link that, that link is
 - John link happy vs. is
 - to link seems vs. be
 - seems link happy vs. be

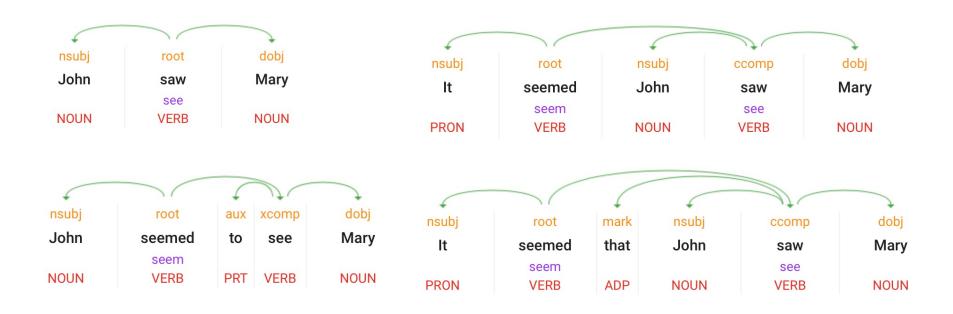
Homework 6 Review

Question 2

- suppose the lower clause is:
 - John saw Mary
- and the raising predicate is seemed:
 - John seemed to see Mary
 - It seems (that) John saw Mary

- Does the SP program do better on these examples?
 - John saw Mary
 - John seems saw Mary (cf. Q1)
 - It seems John saw Mary
 - It seems that John saw Mary
 - John seemed to see Mary

Homework 6: Question 2 Review



Homework 6: Question 2 Review

John saw Mary

It seemed John saw Mary

It seemed that John saw Mary

John seemed to see Mary

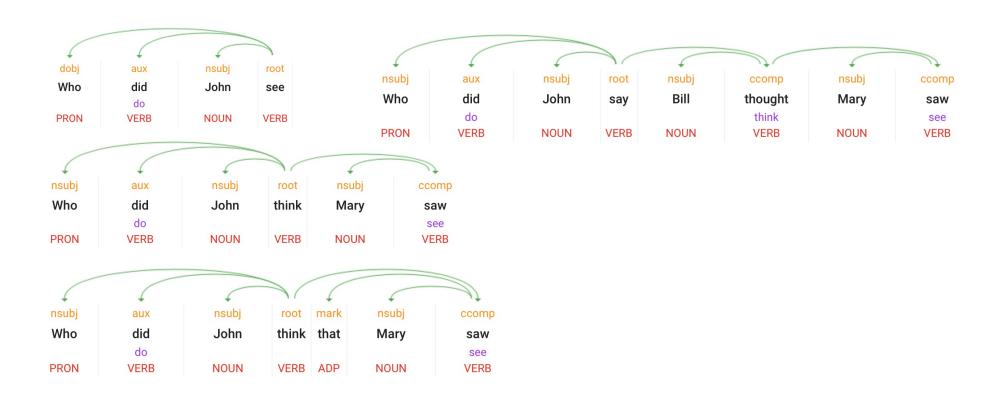
- Differences:
 - none
 - none
 - none
 - seemed ... Mary

Homework 6: Question 3 Review

Question 3

- Consider object wh-question formation:
 - Who did John see
 - Who did John think (that) Mary saw
 - Who did John (that) say Bill (that) thought Mary saw

Homework 6: Question 3 Review



Homework 6: Question 3 Review

Who did John see

Who did John think Mary saw

Who did John think that Mary saw

Who did John say Bill thought Mary saw

Who did John say Bill thought that Mary saw

Who did John say that Bill thought Mary saw

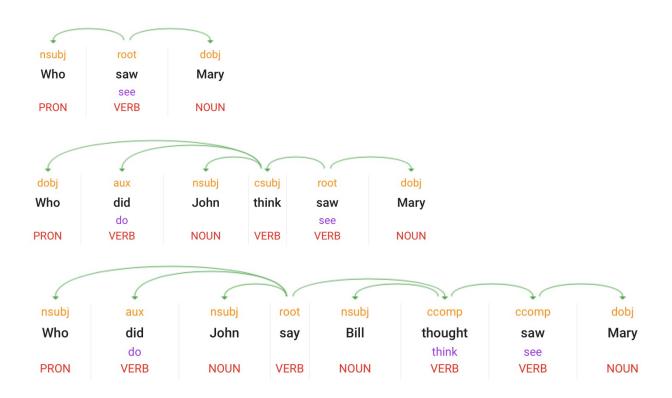
Who did John say that Bill thought that Mary saw

Homework 6

Question 4

- Consider subject wh-question formation:
 - Who saw Mary
 - Who did John think saw Mary
 - Who did John say (that) Bill thought saw Mary

Homework 6: Question 4 Review



Homework 6: Question 4 Review

Who saw Mary

Who did John think saw Mary

Who did John say Bill thought saw Mary

Who did John say that Bill thought saw Mary

• Differences:

- None
- Who ... saw

• Who ... Bill

Stanford CoreNLP

- Java-based
- "CoreNLP enables users to derive linguistic annotations for text, including token and sentence boundaries, parts of speech, named entities, numeric and time values, dependency and constituency parses, coreference, sentiment, quote attributions, and relations."
- "CoreNLP currently supports 8 languages: Arabic, Chinese, English, French, German, Hungarian, Italian, and Spanish."
- Run it online or download and run it from your own machine.
- URL:
 - https://stanfordnlp.github.io/CoreNLP/index.html

Java 8

- In JDK 8 and JRE 8, the version strings are 1.8 and 1.8.0.
- Example:

```
java -version
java version "1.8.0_191"
Java(TM) SE Runtime Environment (build 1.8.0_191-b12)
Java HotSpot(TM) 64-Bit Server VM (build 25.191-b12, mixed mode)
```

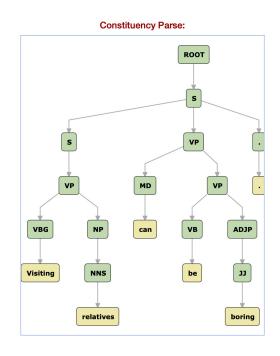
CoreNLP Online

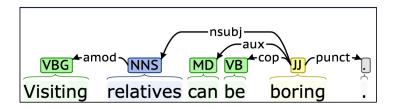
- URL:
 - https://corenlp.run



CoreNLP Online

Visiting relatives can be boring.





CoreNLP: command line

```
(base) stanford-corenlp-4.4.0% java -cp "*" edu.stanford.nlp.pipeline.StanfordCoreNLP -file input2.txt
[main] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Searching for resource:
StanfordCoreNLP.properties ... found.

...
[main] INFO edu.stanford.nlp.tagger.maxent.MaxentTagger - Loading POS tagger from edu/stanford/nlp/models/pos-tagger/english-left3words-distsim.tagger ... done [0.4 sec].

...
[main] INFO edu.stanford.nlp.parser.nndep.DependencyParser - Initializing dependency parser ... done [1.9 sec].

...

Processing file /Users/sandiway/Downloads/stanford-corenlp-4.4.0/input2.txt ... writing to /Users/sandiway/Downloads/stanford-corenlp-4.4.0/input2.txt.out

Annotating file /Users/sandiway/Downloads/stanford-corenlp-4.4.0/input2.txt ... done [0.3 sec].

Annotation pipeline timing information:

TOTAL: 0.3 sec. for 6 tokens at 17.9 tokens/sec.

Pipeline setup: 21.5 sec.

Total time for StanfordCoreNLP pipeline: 21.8 sec.
```

CoreNLP: command line

Document: ID=input2.txt (1 sentences, 6 tokens)

Sentence #1 (6 tokens):

Visiting relatives can be boring.

Tokens:

[Text=Visiting CharacterOffsetBegin=0 CharacterOffsetEnd=8
PartOfSpeech=VBG Lemma=visit NamedEntityTag=0]

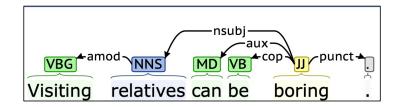
[Text=relatives CharacterOffsetBegin=9 CharacterOffsetEnd=18 PartOfSpeech=NNS Lemma=relative NamedEntityTag=0]

[Text=can CharacterOffsetBegin=19 CharacterOffsetEnd=22 PartOfSpeech=MD Lemma=can NamedEntityTag=0]

[Text=be CharacterOffsetBegin=23 CharacterOffsetEnd=25
PartOfSpeech=VB Lemma=be NamedEntityTag=0]

[Text=boring CharacterOffsetBegin=26 CharacterOffsetEnd=32
PartOfSpeech=JJ Lemma=boring NamedEntityTag=0]

[Text=. CharacterOffsetBegin=32 CharacterOffsetEnd=33
PartOfSpeech=. Lemma=. NamedEntityTag=0]



Dependency Parse (enhanced plus plus dependencies):

```
root(R00T-0, boring-5)
amod(relatives-2, Visiting-1)
nsubj(boring-5, relatives-2)
aux(boring-5, can-3)
cop(boring-5, be-4)
punct(boring-5, .-6)
```

Textual (Stanford)
or CoNLL-U format
useful for further processing

Extracted the following NER entity mentions:

Stanza

Stanza – A Python NLP Package for Many Human Languages

pypi v1.3.0 conda v1.3.0 python 3.6 | 3.7 | 3.8

Stanza is a collection of accurate and efficient tools for the linguistic analysis of many human languages. Starting from raw text to syntactic analysis and entity recognition, Stanza brings state-of-the-art NLP models to languages of your choosing.

Stanza is a Python natural language analysis package. It contains tools, which can be used in a pipeline, to convert a string containing human language text into lists of sentences and words, to generate base forms of those words, their parts of speech and morphological features, to give a syntactic structure dependency parse, and to recognize named entities. The toolkit is designed to be parallel among more than 70 languages, using the Universal Dependencies formalism.

- Stanza is built with highly accurate neural network components that also enable efficient training and evaluation with your own annotated data. The modules are built on top of the PyTorch library. You will get much faster performance if you run the software on a GPU-enabled machine.
- In addition, Stanza includes a Python interface to the <u>CoreNLP Java</u> <u>package</u> and inherits additional functionality from there, such as constituency parsing, coreference resolution, and linguistic pattern matching.

stanfordnlp.github.io/stanza

Stanza – A Python NLP Package for Many Human Languages

- Native Python implementation requiring minimal efforts to set up;
- Full neural network pipeline for robust text analytics, including tokenization, multi-word token (MWT) expansion, lemmatization, part-of-speech (POS) and morphological features tagging, dependency parsing, and named entity recognition;
- Pretrained neural models supporting 66 (human) languages;
- A stable, officially maintained Python interface to CoreNLP.

Peng Qi, Yuhao Zhang, Yuhui Zhang, Jason Bolton and Christopher D. Manning. 2020. <u>Stanza: A Python Natural Language</u> <u>Processing Toolkit for Many Human Languages</u>. In Association for Computational Linguistics (ACL) System Demonstrations. 2020.

• Install:

```
~$ which python3
/Library/Frameworks/Python.framework/Versions/3.8/bin/python3
~$ which pip3
/Library/Frameworks/Python.framework/Versions/3.8/bin/pip3
~$ pip3 install stanza
```

stanza

Installation details:

```
Collecting stanza
 Downloading stanza-1.2-py3-none-any.whl (282 kB)
     Collecting torch>=1.3.0
 Downloading torch-1.8.1-cp38-none-macosx_10_9_x86_64.whl (119.6 MB)
     Requirement already satisfied: requests in /Library/Frameworks/Python.framework/Versions/3.8/lib/python3.8/site-packages (from stanza) (2.22.0)
Collecting tqdm
 Downloading tqdm-4.60.0-py2.py3-none-any.whl (75 kB)
     Collecting protobuf
 Downloading protobuf-3.17.0-cp38-cp38-macosx_10_9_x86_64.whl (959 kB)
     Requirement already satisfied: numpy in ./Library/Python/3.8/lib/python/site-packages (from stanza) (1.18.1)
Collecting typing-extensions
 Downloading typing_extensions-3.10.0.0-py3-none-any.whl (26 kB)
Requirement already satisfied: certifi>=2017.4.17 in /Library/Frameworks/Python.framework/Versions/3.8/lib/python3.8/site-packages (from requests->stanza)
Requirement already satisfied: urllib3!=1.25.0,!=1.25.1,<1.26,>=1.21.1 in /Library/Frameworks/Python.framework/Versions/3.8/lib/python3.8/site-packages (from requests->stanza) (1.25.8)
Requirement already satisfied: idna<2.9,>=2.5 in /Library/Frameworks/Python.framework/Versions/3.8/lib/python3.8/site-packages (from requests->stanza) (2.8)
Requirement already satisfied: chardet<3.1.0,>=3.0.2 in /Library/Frameworks/Python.framework/Versions/3.8/lib/python3.8/site-packages (from requests->stanza) (3.0.4)
Requirement already satisfied: six>=1.9 in ./Library/Python/3.8/lib/python/site-packages (from protobuf->stanza) (1.13.0)
Installing collected packages: typing-extensions, torch, tgdm, protobuf, stanza
Successfully installed protobuf-3.17.0 stanza-1.2 torch-1.8.1 tqdm-4.60.0 typing-extensions-3.10.0.0
```

stanza

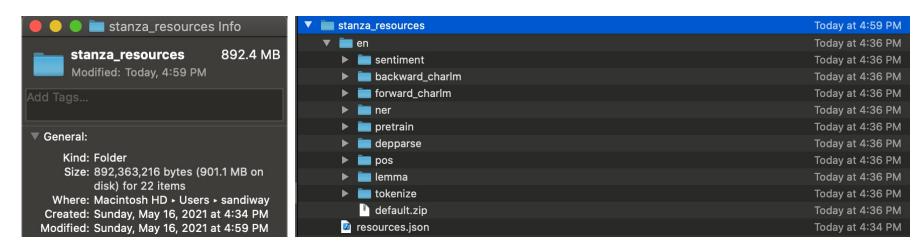
• Run:

```
~$ python3
Python 3.8.3 (v3.8.3:6f8c8320e9, May 13 2020, 16:29:34)
[Clang 6.0 (clang-600.0.57)] on darwin
Type "help", "copyright", "credits" or "license" for more information.
>>> import stanza
>>> stanza.download('en')
Downloading https://raw.githubusercontent.com/stanfordnlp/stanza-resources/master/resources_1.2.0.json: 128kB [00:00, 45.8MB/s]
2021-05-16 16:34:20 INFO: Downloading default packages for language: en (English)...
Downloading http://nlp.stanford.edu/software/stanza/1.2.0/en/default.zip: 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% | 100% |
```

```
Processor | Package
 tokenize | combined
 pos
            | combined
            | combined
 lemma
 depparse | combined
 sentiment | sstplus
| ner
            ontonotes
2021-05-16 16:38:41 INFO: Use device: cpu
2021-05-16 16:38:41 INFO: Loading: tokenize
2021-05-16 16:38:41 INFO: Loading: pos
2021-05-16 16:38:41 INFO: Loading: lemma
2021-05-16 16:38:41 INFO: Loading: depparse
2021-05-16 16:38:42 INFO: Loading: sentiment
2021-05-16 16:38:42 INFO: Loading: ner
2021-05-16 16:38:43 INFO: Done loading processors!
```

stanza

• Files in the home directory:



stanza: example

```
• Assume:
import stanza
stanza.download('en')
nlp = stanza.Pipeline('en')

• Example again:
>>> doc = nlp('Visiting relatives is boring.')
>>> for s in doc.sentences:
... for w in s.words:
... print(w.id, w.text, w.pos, w.deprel, w.head)
...
1 Visiting VERB csubj 4
2 relatives NOUN obj 1
3 is AUX cop 4
4 boring ADJ root 0
5 . PUNCT punct 4
```

stanza: example

```
>>> import stanza
>>> nlp = stanza.Pipeline('en')
>>> doc = nlp('Visiting relatives is boring.')
>>> doc.sentences[0]
... lots of output
>>> doc.sentences[1]
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
IndexError: list index out of range
>>> doc.sentences[0].print_dependencies()
('Visiting', 4, 'csubj')
('relatives', 1, 'obj')
('is', 4, 'cop')
('boring', 0, 'root')
('.', 4, 'punct')
>>>
```

https://stanfordnlp.github.io/stanza/corenlp_client.html

Stanford CoreNLP Client

Stanza allows users to access our Java toolkit, Stanford CoreNLP, via its server interface, by writing native Python code. Stanza does this by first launching a Stanford CoreNLP server in a background process, and then sending annotation requests to this server process. The response from the CoreNLP server will then be parsed and rendered into a Document protobuf object. As a result of this server-client communication, users can obtain annotations by writing native Python program at the client side, and do not need to worry about anything on the Java server side.

• installation (you get an extra copy of CoreNLP):

```
>>> stanza.install_corenlp()
2022-03-01 11:13:55 INFO: Installing CoreNLP package into
/Users/sandiway/stanza_corenlp...
Downloading https://huggingface.co/stanfordnlp/CoreNLP/resolve/main/stanford-cor
```

- Uses a server (i.e *load only once, stay alive*)
- Run:

```
>>> from stanza.server import CoreNLPClient
>>> text = "Visiting relatives can be boring."
>>> with CoreNLPClient(annotators=['tokenize','ssplit','pos','lemma','ner',
'parse', 'depparse','coref'], timeout=30000, memory='6G') as client:
... ann = client.annotate(text)
```

2022-03-01 11:27:10 INFO: Writing properties to tmp file: corenlp_server-982e55f3530e4961.props

2022-03-01 11:27:10 INFO: Starting server with command: java -Xmx6G-cp /Users/sandiway/stanza_corenlp/* edu.stanford.nlp.pipeline.StanfordCoreNLPServer-port 9000-timeout 30000-threads 5-maxCharLength 100000-quite False -serverProperties corenip_server-982e55f3530e4961.props -annotators tokenize.spsilit.pos_lemman_erp_parse_deparse_coref -preload -outputFormat serialized

[main] INFO CoreNLP - --- StanfordCoreNLPServer#main() called ---

[main] INFO CoreNLP - Server default properties:

(Note: unspecified annotator properties are English defaults)

annotators = tokenize,ssplit,pos,lemma,ner,parse,depparse,coref

inputFormat = text

outputFormat = serialized

prettyPrint = false

[main] INFO CoreNLP - Threads: 5

[main] INFO edu.stanford.nlp.ie.AbstractSequenceClassifier - Loading classifier from edu/stanford/nlp/models/ner/english.all.3class.distsim.crf.ser.gz ... done [0.8 sec].

[main] INFO edu.stanford.nlp.ie.AbstractSequenceClassifier - Loading classifier from edu/stanford/nlp/models/ner/english.muc.7class.distsim.crf.ser.gz ... done [0.4 sec].

[main] INFO edu.stanford.nlp.ie.AbstractSequenceClassifier - Loading classifier from edu/stanford/nlp/models/ner/english.conll.4class.distsim.crf.ser.gz ... done [1.6 sec].

[main] INFO edu.stanford.nlp.time.JollyDayHolidays - Initializing JollyDayHoliday for SUTime from classpath edu/stanford/nlp/models/sutime/jollyday/Holidays sutime.xml as

 $[main]\ INFO\ edu.stanford.nlp.time.TimeExpressionExtractorImpl-\ Using\ following\ SUTime\ rules: \\ edu/stanford/nlp/models/sutime/defs.sutime.txt,edu/stanford/nlp/models/sutime/english.bulidays.sutime.txt \\$

[main] INFO edu.stanford.nlp.pipeline.TokensRegexNERAnnotator - ner.fine.regexner: Read 580705 unique entries out of 581864 from edu/stanford/nlp/models/kbp/english/gazetteers/regexner_caseless.tab, 0 TokensRegex patterns.

[main] INFO edu.stanford.nlp.pipeline.TokensRegexNERAnnotator - ner.fine.regexner: Read 4867 unique entries out of 4867 from edu/stanford/nlp/models/kbp/english/gazetteers/regexner_cased.tab, 0 TokensRegex patterns.

[main] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator depparse

[main] INFO edu.stanford.nlp.parser.nndep.DependencyParser - Loading depparse model: edu/stanford/nlp/models/parser/nndep/english_UD.gz ... Time

 $[main]\ INFO\ edu. stanford. nlp. parser. nndep. Classifier-PreComputed\ 20000\ vectors,\ elapsed\ Time:\ 1.098\ sec$

[main] INFO edu.stanford.nlp.parser.nndep.DependencyParser - Initializing dependency parser ... done [2.2 sec] [main] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator coref

 $[main] INFO\ edu. stanford. nlp. coref. statistical. Simple Linear Classifier-Loading\ coref\ model\ edu/stanford/nlp/models/coref/statistical/ranking_model.ser. gz\ ...$ done [0.8 sec].

[main] INFO edu.stanford.nlp.pipeline.CorefMentionAnnotator - Using mention detector type: dependency

[main] INFO CoreNLP - Starting server...

[main] INFO CoreNLP - StanfordCoreNLPServer listening at /0:0:0:0:0:0:0:0:0:09000

[pool-1-thread-3] INFO CoreNLP - [/0:0:0:0:0:0:0:0:1:64727] API call w/annotators tokenize,ssplit,pos,lemma,ner,parse,depparse,coref

Visiting relatives can be boring.

[pool-1-thread-3] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator tokenize

[pool-1-thread-3] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator ssplit

[pool-1-thread-3] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator pos

[pool-1-thread-3] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator lemma

[pool-1-thread-3] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator ner

[pool-1-thread-3] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator parse

[pool-1-thread-3] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator depparse

[pool-1-thread-3] INFO edu.stanford.nlp.pipeline.StanfordCoreNLP - Adding annotator coref

[Thread-0] INFO CoreNLP - CoreNLP Server is shutting down.

```
>>> s = ann.sentence[0]
>>> parse = s.parseTree
>>> print(parse)
child {
child {
 child {
  child {
   child {
    value: "Visiting"
   value: "VBG"
   score: -9.652259826660156
  child {
   child {
    child {
     value: "relatives"
    value: "NNS"
    score: -8.183259010314941
```

```
value: "NP"

score: -10.886569023132324
}
value: "VP"
score: -22.3214054107666
}
value: "S"
score: -23.077627182006836
}
child {
child {
child {
value: "can"
}
value: "MD"
score: -2.0786099433898926
}
```

```
child {
    child {
        child {
            value: "be"
    }
      value: "VB"
      score: -0.009304866194725037
}
child {
    child {
      child {
      child {
      value: "boring"
    }
      value: "JJ"
      score: -8.483654975891113
}
value: "ADJP"
      score: -9.187541007995605
}
value: "VP"
      score: -13.377534866333008
}
```

```
value: "VP"

score: -
17.71254539489746
}
child {
    child {
        value: "."
    }
    value: "."

o.05752464756369591
}
value: "S"

score: -
47.101341247558594
}
value: "ROOT"
score: -47.27272033691406
```

>>> print(s.basicDependencies)

```
node {
                                  edge {
 sentenceIndex: 0
                                     source: 2
 index: 2
                                    target: 1
                                    dep: "amod"
node {
 sentenceIndex: 0
                                    isExtra: false
 index: 1
                                    sourceCopy: 0
}
                                     targetCopy: 0
node {
 sentenceIndex: 0
                                     language: UniversalEnglish
 index: 5
                                  edge {
node {
 sentenceIndex: 0
                                    source: 5
 index: 3
                                    target: 2
                                    dep: "nsubj"
node {
 sentenceIndex: 0
                                     isExtra: false
 index: 4
                                     sourceCopy: 0
}
                                     targetCopy: 0
node {
 sentenceIndex: 0
                                     language: UniversalEnglish
 index: 6
```

```
edge {
edge {
  source: 5
                                        source: 5
  target: 3
                                        target: 6
  dep: "aux"
                                        dep: "punct"
  isExtra: false
                                        isExtra: false
  sourceCopy: 0
                                        sourceCopy: 0
  targetCopy: 0
                                        targetCopy: 0
  language: UniversalEnglish
                                        language: UniversalEnglish
}
edge {
                                      root: 5
  source: 5
  target: 4
  dep: "cop"
  isExtra: false
  sourceCopy: 0
  targetCopy: 0
 language: UniversalEnglish
}
```