# COMS 4705 Natural Language Processing (2020 Spring) Homework 2

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## Problem 1 PCFGs and HMMs

1. For sequences: they are baking potatoes, we get two possible sequence of tags, according to the calculation of Problem 2. They are separately:

Parse 1: PRP V Adj N Parse 2: PRP Aux V N

Since  $P(tags, words) = P(words|tags) \cdot P(tags)$ :

The probability of Parse 1 is:

 $\begin{aligned} \mathbf{P}_1 &= P(they|PRP) \cdot P(are|V) \cdot P(baking|Adj) \cdot P(potatoes|N) \cdot P(PRP, V, Adj, N) \\ &= 1.0*0.5*1.0*1.0*1.0*0.1*0.8*0.3*0.6 = 0.0072 \end{aligned}$ 

The probability of Parse 2 is:

```
\begin{aligned} & P_2 = P(they|PRP) \cdot P(are|Aux) \cdot P(baking|V) \cdot P(potatoes|N) \cdot P(PRP, Aux, V, N) \\ & = 1.0 * 0.1 * 1.0 * 0.2 * 1.0 * 0.5 * 0.6 * 1.0 = 0.006 \end{aligned}
```

### 2. HMM

the HMM I design is: emission probability:

P(they|PRP) = 1.0 P(potatoes|N) = 1.0 P(baking|Adj) = 1.0 P(baking|V) = 0.5 P(are|V) = 0.5 P(are|Aux) = 1.0

transition probability:

```
P(PRP|S) = 0.1

P(V|PRP) = 0.8

P(Adj|V) = 0.3

P(N|Adj) = 0.6

P(Aux|PRP) = 0.2

P(V|Aux) = 1.0

P(N|V) = 0.6
```

```
For Parse 1: the probability calculated by HMMs is: P(they|PRP)*P(are|V)*P(baking|Adj)*P(potatoes|N)*P(PRP|S)*P(V|PRP)*P(Adj|V)*P(N|Adj)=0.0072
```

```
For Parse 2: the probability calculated by HMMs is: P(they|PRP)*P(are|Aux)*P(baking|V)*P(potatoes|N)*P(PRP|S)*P(Aux|PRP)*P(V|Aux)*P(N|V)=0.006
```

So, in sum, the HMM I have designed is same as the PCFG.

## 3. any PCFG can be translated into an HMM

The explanation is as follows: HMMSs is essentially context free grammar because HMM is based on Markov assumption that current state is only depends on the previous state. As the same time, we know PCFG is a form of CNF:  $A \to B$  C and  $A \to b$ , the probability of  $P(A \to b)$  we could consider as P(b|A). obviously, the PCFG also meets Markov assumption. So HMM and PCFG, essentially, is the same kind of thing.

# Problem 2 Earley Parser

## 1. Parsing with Earley Algorithm

Notes: Do not need to convert to CNF.

Let's denote char[i] contains all parser items that end in position i.

Chart[0] · they are baking potatoes

	one, are saming por	acces		
StateID	dotted-rule	position	back pointers	operation
$S_0$	$S \to \cdot NP \ VP$	[0, 0]		Predict
$S_1$	$NP \rightarrow \cdot Adj \ NP$	[0, 0]		Predict
$S_2$	$NP \rightarrow \cdot PRP$	[0, 0]		Predict
$S_3$	$NP \rightarrow \cdot N$	[0, 0]		Predict
$S_4$	$Adj \rightarrow \cdot baking$	[0, 0]		do not scan, baking $\neq S[0] = they$
$S_5$	$PRP \rightarrow \cdot they$	[0, 0]		scan
$S_6$	$N  o \cdot potatoes$	[0, 0]		do not scan, potatoes $\neq S[0] = they$

Chart[1] they  $\cdot$  are baking potatoes

StateID	dotted-rule	position	back pointers	operation
$S_7$	$PRP \rightarrow \text{they} \cdot$	[0, 0]		Complete
$S_8$	$NP \to PRP$ ·	[0, 1]	$[s_7]$	Complete
$S_9$	$S \to \text{NP} \cdot VP$	[0, 1]	$[s_8]$	Predict
$S_{10}$	$VP \rightarrow \cdot V NP$	[1, 1]		Predict
$S_{11}$	$VP \rightarrow \cdot Aux \ V \ NP$	[1, 1]		Predict
$S_{12}$	$V  ightarrow \cdot baking$	[1, 1]		do not scan, baking $\neq S[1] = are$
$S_{13}$	$V \rightarrow \cdot are$	[1, 1]		Scan
$S_{14}$	$Aux \rightarrow \cdot are$	[1, 1]		Scan

Chart[2] they are  $\cdot$  baking potatoes

	ncy are baking pour	10005		
StateID	dotted-rule	position	back pointers	operation
$S_{15}$	$V \to {\rm are} \cdot$	[1, 2]		Complete
$S_{16}$	$Aux \rightarrow \text{are} \cdot$	[1, 2]		Complete
$S_{17}$	$VP \to NP \cdot VP$	[1, 2]	$[S_{15}]$	Predict
$S_{18}$	$V \to \mathrm{Aux} \cdot V \ NP$	[1, 2]	$[S_{16}]$	Predict
$S_{19}$	$NP \rightarrow \cdot Adj \ NP$	[2, 2]		Predict
$S_{20}$	$NP \rightarrow \cdot PRP$	[2, 2]		Predict
$S_{21}$	$NP \rightarrow \cdot N$	[2, 2]		Predict
$S_{22}$	$V \rightarrow \cdot \ baking$	[2, 2]		Scan
$S_{23}$	$V \rightarrow \cdot are$	[2, 2]		do not Scan,S[2] = baking $\neq are$
$S_{24}$	$Adj \rightarrow \cdot baking$	[2, 2]		Scan
$S_{25}$	$PRP \rightarrow \cdot they$	[2, 2]		do not scan, $S[2] = baking \neq they$
$S_{26}$	$N \rightarrow \cdot \ potatoes$	[2, 2]		do not scan, $S[2] = baking \neq potatoes$

Chart[3] they are baking  $\cdot$  potatoes

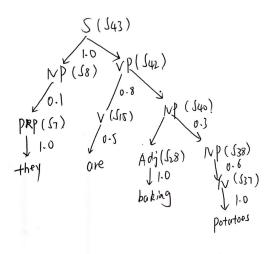
StateID	dotted-rule	position	back pointers	operation
$S_{27}$	$V \to \text{baking} \cdot$	[2, 3]		Complete
$S_{28}$	$Adj \rightarrow \text{baking} \cdot$	[2, 3]		Complete
$S_{29}$	$VP \to \text{Aux V} \cdot NP$	[1, 3]	$[S_{16}, S_{18}]$	Predict
$S_{30}$	$NP \to \mathrm{Adj} \cdot NP$	[2, 3]	$[S_{19}]$	Predict
$S_{31}$	$NP \to \mathrm{Adj} \cdot NP$	[3, 3]		Predict
$S_{32}$	$NP \rightarrow \cdot PRP$	[3, 3]		Predict
$S_{33}$	$NP \rightarrow \cdot N$	[3, 3]		Predict
$S_{34}$	$Adj \rightarrow \cdot \ baking$	[3, 3]		do not scan, $S[3] = potatoes \neq baking$
$S_{35}$	$PRP \rightarrow \cdot they$	[3, 3]		do not Scan,S[3] = potatoes $\neq they$
$S_{36}$	$N \rightarrow \cdot \ potatoes$	[3, 3]		Scan

Chart[4] they are baking potatoes.

	J - O I			
StateID	dotted-rule	position	back pointers	operation
$S_{37}$	$N \to \text{potatoes}$ .	[3, 4]		Complete
$S_{38}$	$NP \rightarrow N$ .	[3, 4]	[S37]	Complete
$S_{39}$	$VP \to \text{Aux V NP}$	[1, 4]	$[S_{16}, S_{27}, S_{38}]$	Complete
$S_{40}$	$NP \to \mathrm{Adj} \ \mathrm{NP} \ \cdot$	[2, 4]	$[S_{28}, S_{38}]$	Complete
$S_{41}$	$S \to \mathrm{NP} \ \mathrm{VP} \cdot$	[0, 4]	$[S_{39}]$	Complete
$S_{42}$	$VP \rightarrow V NP \cdot$	[1, 4]	$[S_{15}, S_{40}]$	Complete
$S_{43}$	$S \to \text{NP VP} \cdot$	[0, 4]	$[S_8, S_{42}]$	Complete

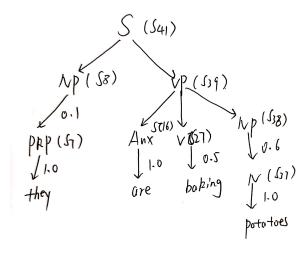
## 2. Write down all parsing trees

Tree 1:



The probability for PCFG: 
$$1.0 * 0.1 * 1.0 * 0.8 * 0.5 * 0.3 * 1.0 * 0.6 * 1.0 = 0.0072$$

Tree 2:



The probability for PCFG: 
$$1.0 * 0.1 * 1.0 * 0.2 * 1.0 * 0.5 * 0.6 * 1.0 = 0.006$$

## Problem 3 CKY parsing

#### 1. Convert to CNF

Converted rules are as follows:

 $S \to NP VP$ 

 $NP \to \mathrm{Adi} \ \mathrm{NP}$ 

 $VP \to V NP$ 

 $VP \to \text{Aux VP}$ 

 $Adj \rightarrow baking$ 

 $V \to \text{baking}$ 

 $V \to are$ 

 $Aux \rightarrow are$ 

 $NP \to \text{they}$ 

 $NP \rightarrow \text{potatoes}$ 

- (a) For Rules of the form  $A \to B$ , we should replace rhs with other rules until the rhs become one terminal or two non terminals. For example, here I combined  $NP \to PRP$  and  $PRP \to they$ , I got  $NP \to they$ .
- (b) For rules with three or more nonterminals on the right hand side, we could recursively combine right hand side non terminals into single terminals until there are only two non terminals left. For example, here I utilized  $VP \to Aux\ V\ NP$  and  $VP \to V\ NP$ , I got  $VP \to Aux$ .

#### 2. CKY Parsing

#### CKY Parsing chart:

0	1(they)	2(are)	3(baking)	4(potatoes)
0	NP			S
1		V, Aux		VP, VP
2			Adj, V	NP, NP
				NP

the back pointers:

when length = 2:

$$NP[2,4] \rightarrow Adj[2,3]\ NP[3,4]$$

$$VP[2,4] \to V[2,3] \ NP[3,4]$$

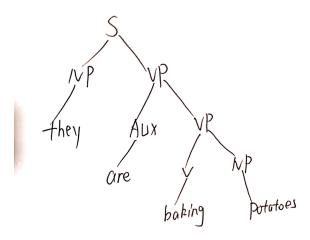
when length = 3:

$$VP[1,4] \to V[1,2] NP[2,4]$$

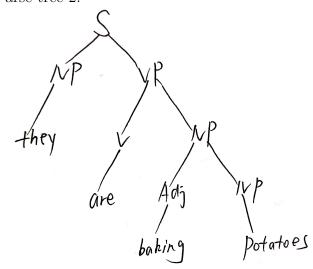
$$VP[1,4] \to Aux[1,2] \ VP[2,4]$$

when length = 4: 
$$S[0,4] \rightarrow NP[0,1] VP[1,4]$$

Based on these above information, we can got two parsing tree: Parse tree 1:



## Parse tree 2:



## Problem 4 Transition Based Dependency Parsing

Arc-standard dependency parser:

```
Initial State:
([root]_{\delta}, [he, sent, her, a, funny, meme, today]_{\beta}, \{\}_A)
    Transition 1: Shift
([he, root]_{\delta}, [sent, her, a, funny, meme, today]_{\beta}, \{\}_{A})
    Transition 2: Left-Arc
([root]_{\delta}, [sent, her, a, funny, meme, today]_{\beta}, \{(sent, nsubj, he)\}_{A})
    Transition 3: Shift
([sent, root]_{\delta}, [her, a, funny, meme, today]_{\beta}, \{(sent, nsubj, he)\}_A)
    Transition 4: Right-Arc
([root]_{\delta}, [sent, a, funny, meme, today]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her)\}_A)
    Transition 5: Shift
([sent, root]_{\delta}, [a, funny, meme, today]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her)\}_A)
    Transition 6: Shift
([a, sent, root]_{\delta}, [funny, meme, today]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her)\}_{A})
    Transition 7: Shift
([funny, a, sent, root]_{\delta}, [meme, today]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her)\}_{A})
    Transition 8: Left-Arc
([a, sent, root]_{\delta}, [meme, today]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her), (meme, amod, funny)\}_A)
    Transition 9: Left-Arc
([sent, root]_{\delta}, [meme, today]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her), (meme, amod, funny), (meme, det, a)\}_A)
```

Transition 10: Right-Arc

```
\begin{split} &([root]_{\delta}, [sent, today]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her), (meme, amod, funny), (meme, det, a), (sent, dobj, meme)\}_{A}) \\ &&\quad \text{Transition 11: Shift} \\ &([sent, root]_{\delta}, [today]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her), (meme, amod, funny), (meme, det, a), (sent, dobj, meme)\}_{A}) \\ &&\quad \text{Transition 12: Right-Arc} \\ &([root]_{\delta}, [sent]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her), (meme, amod, funny), (meme, det, a), (sent, dobj, meme), (send, advmod, today)\}_{A}) \\ &&\quad \text{Transition 13: Right-Arc} \\ &([]_{\delta}, [root]_{\beta}, \{(sent, nsubj, he), (sent, jobj, her), (meme, amod, funny), (meme, det, a), (sent, dobj, meme), (send, advmod, today), (root, pred, sent)\}_{A}) \\ &&\quad \text{Transition 14: Right-Arc} \\ &([root]_{\delta}, []_{\beta}, \{(sent, nsubj, he), (sent, jobj, her), (meme, amod, funny), (meme, det, a), (sent, dobj, meme), (send, advmod, today), (root, pred, sent)\}_{A}) \end{split}
```

# Programming part

## HW2 NLP

March 3, 2020

## 1 Programming Part

#### 1.1 Part 1 PCFGs and HMMs

```
[21]: import sys
from collections import defaultdict
from math import fsum
```

```
[22]: class Pcfg(object):
          Represent a probabilistic context free grammar.
          def __init__(self, grammar_file):
              self.rhs_to_rules = defaultdict(list)
              self.lhs_to_rules = defaultdict(list)
              self.startsymbol = None
              self.read_rules(grammar_file)
          def read_rules(self,grammar_file):
              for line in grammar_file:
                  line = line.strip()
                  if line and not line.startswith("#"):
                      if "->" in line:
                          rule = self.parse_rule(line.strip())
                          lhs, rhs, prob = rule
                          self.rhs_to_rules[rhs].append(rule)
                          self.lhs_to_rules[lhs].append(rule)
                      else:
                          startsymbol, prob = line.rsplit(";")
                          self.startsymbol = startsymbol.strip()
          def parse_rule(self,rule_s):
              lhs, other = rule_s.split("->")
              lhs = lhs.strip()
              rhs_s, prob_s = other.rsplit(";",1)
```

```
prob = float(prob_s)
        rhs = tuple(rhs_s.strip().split())
        return (lhs, rhs, prob)
   def verify_grammar(self):
        Return True if the grammar is a valid PCFG in CNF.
        Otherwise return False.
        # TODO, Part 1
        # value is a list
       for key, value in self.lhs_to_rules.items():
            temp_list = []
            for var in value:
                temp_list.append(var[2])
            if abs(1 - math.fsum(temp_list)) > 0.00001:
                print("invalid PCFG in CNF")
                return False
       return True
111
if __name__ == "__main__":
   with open(sys.argv[1],'r') as grammar_file:
        grammar = Pcfg(grammar_file)
   with open('./atis3.pcfg','r') as grammar_file:
        grammar = Pcfq(grammar_file)
        print(grammar.verify_grammar())
```

### 1.1.1 test for Part 1 reading the grammar and getting started

True

#### 1.2 Part 2-5

```
[9]: import math import sys from collections import defaultdict import itertools from grammar import Pcfg import numpy as np
```

```
[10]: | ### Use the following two functions to check the format of your data structures__
       → in part 3 ###
      def check_table_format(table):
          HHHH
          Return true if the backpointer table object is formatted correctly.
          Otherwise return False and print an error.
          if not isinstance(table, dict):
              sys.stderr.write("Backpointer table is not a dict.\n")
              return False
          for split in table:
              if not isinstance(split, tuple) and len(split) ==2 and \
                isinstance(split[0], int) and isinstance(split[1], int):
                   sys.stderr.write("Keys of the backpointer table must be tuples_
       \hookrightarrow (i,j) representing spans.\n")
                   return False
              if not isinstance(table[split], dict):
                   sys.stderr.write("Value of backpointer table (for each span) is not_{\sqcup}
       \rightarrowa dict.\n")
                  return False
              for nt in table[split]:
                   if not isinstance(nt, str):
                       sys.stderr.write("Keys of the inner dictionary (for each span)
       →must be strings representing nonterminals.\n")
                       return False
                   bps = table[split][nt]
                   if isinstance(bps, str): # Leaf nodes may be strings
                       continue
                   if not isinstance(bps, tuple):
                       sys.stderr.write("Values of the inner dictionary (for each span_
       \rightarrowand nonterminal) must be a pair ((i,k,A),(k,j,B)) of backpointers. Incorrect
       →type: {}\n".format(bps))
                       return False
                   if len(bps) != 2:
                       sys.stderr.write("Values of the inner dictionary (for each span,
       \rightarrowand nonterminal) must be a pair ((i,k,A),(k,j,B)) of backpointers. Found
       →more than two backpointers: {}\n".format(bps))
                       return False
```

```
for bp in bps:
                if not isinstance(bp, tuple) or len(bp)!=3:
                    sys.stderr.write("Values of the inner dictionary (for each_
 \rightarrowspan and nonterminal) must be a pair ((i,k,A),(k,j,B)) of backpointers.
 →Backpointer has length != 3.\n".format(bp))
                    return False
                if not (isinstance(bp[0], str) and isinstance(bp[1], int) and
 →isinstance(bp[2], int)):
                    print(bp)
                    sys.stderr.write("Values of the inner dictionary (for each_
 \hookrightarrowspan and nonterminal) must be a pair ((i,k,A),(k,j,B)) of backpointers.
 →Backpointer has incorrect type.\n".format(bp))
                    return False
    return True
def check_probs_format(table):
    11 11 11
    Return true if the probability table object is formatted correctly.
    Otherwise return False and print an error.
    if not isinstance(table, dict):
        sys.stderr.write("Probability table is not a dict.\n")
        return False
    for split in table:
        if not isinstance(split, tuple) and len(split) == 2 and__
 →isinstance(split[0], int) and isinstance(split[1], int):
            sys.stderr.write("Keys of the probability must be tuples (i,j)
return False
        if not isinstance(table[split], dict):
            sys.stderr.write("Value of probability table (for each span) is not⊔
\rightarrowa dict.\n")
            return False
        for nt in table[split]:
            if not isinstance(nt, str):
                sys.stderr.write("Keys of the inner dictionary (for each span)
→must be strings representing nonterminals.\n")
                return False
            prob = table[split][nt]
            if not isinstance(prob, float):
                sys.stderr.write("Values of the inner dictionary (for each span⊔
\rightarrowand nonterminal) must be a float.{}\n".format(prob))
                return False
            if prob > 0:
                sys.stderr.write("Log probability may not be > 0. {}\n".
 →format(prob))
```

```
return False
    return True
class CkyParser(object):
    HHHH
    A CKY parser.
    def __init__(self, grammar):
        Initialize a new parser instance from a grammar.
        self.grammar = grammar
    def is_in_language(self,tokens):
        Membership checking. Parse the input tokens and return True if
        the sentence is in the language described by the grammar. Otherwise
        return False
        11 11 11
        # TODO, part 2
        # CKY for CFG
        table= None
        n = len(tokens)
        # content: possible nontermial ends in the specified position
        # eq{(i,j): {'NP'}}
        table = defaultdict(list)
        table = [None]*n
        for i in range(n):
            table[i] = [list()]*(n+1)
        # initialization
        for i in range(0,n):
            token = tokens[i]
            temp_list = []
            for lhs in self.grammar.rhs_to_rules[tuple([token])]:
                temp_list.append(lhs[0])
            table[(i,i+1)] = temp_list
        # CKY parsing for CFG
```

```
for length in range(2, n+1):
           for i in range(0, n-length+1):
               j = i + length
               for k in range(i+1, j):
                       temp_B = table[(i,k)]
                       temp_C = table[(k,j)]
                       temp_tuples_list = []
                       for temp1 in temp_B:
                           for temp2 in temp_C:
                               temp_tuples_list.append(tuple([temp1,temp2]))
                       for temp_tuple in temp_tuples_list:
                           if len(self.grammar.rhs_to_rules[temp_tuple]) > 0:
                               for lhs in self.grammar.
→rhs_to_rules[temp_tuple]:
                                   if lhs[0] not in table[(i,j)]:
                                       table[(i,j)].append(lhs[0])
       # check if true
       if self.grammar.startsymbol in table[(0,n)]:
           return True
      return False
  def parse_with_backpointers(self, tokens):
       Parse the input tokens and return a parse table and a probability table.
       # TODO, part 3
      table= None
      probs = None
       # content: tuple of split array
      table = defaultdict(defaultdict)
       # content: the prob
      probs = defaultdict(lambda: defaultdict(float))
      n = len(tokens)
       # initialization
       for i in range(0,n):
           token = tokens[i]
           for lhs in self.grammar.rhs_to_rules[tuple([token])]:
               probs[(i,i+1)][lhs[0]] = math.log(lhs[2], 2)
               table[(i,i+1)][lhs[0]] = token
```

```
# parsing
        for length in range(2, n+1):
            for i in range(0, n-length+1):
                j = i + length
                for k in range(i+1, j):
                    temp_B_dict = table[(i,k)]
                    temp_C_dict = table[(k,j)]
                    temp_B = temp_B_dict.keys();
                    temp_C = temp_C_dict.keys();
                    temp tuples list = []
                    for temp1 in temp_B:
                        for temp2 in temp_C:
                             temp_tuples_list.append(tuple([temp1,temp2]))
                    # possible LHS
                    for temp_tuple in temp_tuples_list:
                             if len(self.grammar.rhs_to_rules[temp_tuple]) > 0:
                                 for lhs in self.grammar.
→rhs_to_rules[temp_tuple]:
                                     # with log: multiply means addition
                                     new_log_prob = math.log(lhs[2], 2) +__
→probs[(i,k)][temp_tuple[0]] + probs[(k,j)][temp_tuple[1]]
                                     if probs[(i,j)][lhs[0]] != 0.0:
                                         if probs[(i,j)][lhs[0]] < new_log_prob:</pre>
                                             probs[(i,j)][lhs[0]] = new_log_prob
                                             table[(i,j)][lhs[0]] = 
\rightarrow((temp_tuple[0], i, k), (temp_tuple[1], k, j))
                                     else:
                                         probs[(i,j)][lhs[0]] = new_log_prob
                                         table[(i,j)][lhs[0]] = ((temp_tuple[0], _u
\rightarrowi, k), (temp_tuple[1], k, j))
        return table, probs
def get_tree(chart, i,j,nt):
    Return the parse-tree rooted in non-terminal nt and covering span i, j.
    # TODO: Part 4
    #Recursively traverse the parse chart to assemble this tree.
    temp_list = []
    temp_list.append(nt)
    # left child
    if type(chart[(i,j)][nt]) is not str:
        for child in chart[(i,j)][nt]:
            temp_list.append(get_tree(chart, child[1], child[2], child[0]))
```

```
else:
    temp_list.append(chart[(i,j)][nt])
    return tuple(temp_list)

'''

if __name__ == "__main__":

with open('atis3.pcfg','r') as grammar_file:
    grammar = Pcfg(grammar_file)
    parser = CkyParser(grammar)
    toks =['flights', 'from','miami', 'to', 'cleveland','.']
    #print(parser.is_in_language(toks))
    #table,probs = parser.parse_with_backpointers(toks)
    #assert check_table_format(chart)
    #assert check_probs_format(probs)

'''

'\nif name == " main ":\n \n with open(\'atis3.pcfg\',\'r\') as
```

```
[10]: '\nif __name__ == "__main__":\n \n with open(\'atis3.pcfg\',\'r\') as
    grammar_file: \n grammar = Pcfg(grammar_file) \n parser =
    CkyParser(grammar)\n toks =[\'flights\', \'from\',\'miami\', \'to\',
    \'cleveland\',\'.\'] \n #print(parser.is_in_language(toks))\n
    #table,probs = parser.parse_with_backpointers(toks)\n #assert
    check_table_format(chart)\n #assert check_probs_format(probs)\n'
```

#### 1.2.1 test for Part 2 Membership checking with CKY

```
[11]: with open('atis3.pcfg','r') as grammar_file:
    grammar = Pcfg(grammar_file)
    parser = CkyParser(grammar)
    toks =['flights', 'from','miami', 'to', 'cleveland','.']
```

```
[12]: parser.is_in_language(toks)
```

[12]: True

```
[13]: toks = ['miami', 'flights', 'cleveland', 'from', 'to','.']

parser.is_in_language(toks)
```

[13]: False

## 1.2.2 test for part 3

```
[14]: # test for part 3
with open('atis3.pcfg','r') as grammar_file:
    grammar = Pcfg(grammar_file)
    parser = CkyParser(grammar)
    toks =['flights', 'from', 'miami', 'to', 'cleveland', '.']
```

```
table, probs = parser.parse_with_backpointers(toks)
[507]: table[(0, len(toks))]['TOP']
[507]: (('NP', 0, 5), ('PUN', 5, 6))
[15]: check_table_format(table)
[15]: True
[16]: check_probs_format(probs)
[16]: True
  []: # test for generate tree
      1.2.3 test for Part 4 Retrieving a parse tree
[17]: with open('atis3.pcfg','r') as grammar_file:
           grammar = Pcfg(grammar_file)
           parser = CkyParser(grammar)
           toks =['flights', 'from', 'miami', 'to', 'cleveland', '.']
           table, probs = parser.parse_with_backpointers(toks)
           tree = get_tree(table, 0, len(toks), grammar.startsymbol)
[18]: tree
[18]: ('TOP',
        ('NP',
         ('NP', 'flights'),
         ('NPBAR',
          ('PP', ('FROM', 'from'), ('NP', 'miami')),
          ('PP', ('TO', 'to'), ('NP', 'cleveland')))),
        ('PUN', '.'))
  []: # evaluate_parser.py
      1.3 Part 5 Evaluating the Parser
[19]: from cky import Pcfg, CkyParser, get_tree
       import sys
[20]: from cky import Pcfg, CkyParser, get_tree
       import sys
       def tokenize(line):
```

```
tok = ''
    for c in line:
        if c == " ":
            if tok:
                yield tok
                tok = ""
        elif c == "(" or c==")":
            if tok:
                yield tok
            yield c
            tok = ""
        else:
            tok += c
    if tok:
        yield tok
        tok = ""
def parse_tree(line):
    toks = tokenize(line)
    stack = []
    t = next(toks)
    try:
        while t:
            if t=="(":
                stack.append(t)
            elif t==")":
                subtree = []
                s = stack.pop()
                while s[0]!="(":
                    subtree.append(s)
                    s = stack.pop()
                stack.append(tuple(reversed(subtree)))
            else:
                stack.append(t)
            t = next(toks)
    except StopIteration:
        return stack.pop()
def get_leafs(tree):
    if isinstance(tree,str):
        return [tree]
    else:
        result = []
        for x in tree[1:]:
            result.extend(get_leafs(x))
        return result
```

```
def get_constituents(tree,left=0):
    if not tree:
        return [], left
    start = left
    if isinstance(tree,str):
        return [],left+1
    else:
        result = []
        phrase = tree[0]
        for subtree in tree[1:]:
            subspans, right = get_constituents(subtree, left)
            result.extend(subspans)
            left = right
        result.append((phrase,start,left))
        return result, left
def compute_parseval_scores(gold_tree, test_tree):
    gold_const = set(get_constituents(gold_tree)[0])
    test_const = set(get_constituents(test_tree)[0])
    if not test_const:
        return 0.0,0.0,0.0
    correct = len(gold_const.intersection(test_const))
    recall = correct / float(len(gold_const))
    precision = correct / float(len(test_const))
    fscore = (2*precision*recall) / (precision+recall)
    return precision, recall, fscore
def evaluate_parser(parser, treebank_file):
    total = 0
    unparsed = 0
    fscore_sum = 0.0
    for line in treebank_file:
        gold_tree = parse_tree(line.strip())
        tokens = get_leafs(gold_tree)
        print("input: ",tokens)
        chart,probs = parser.parse_with_backpointers(tokens)
        print("target: ",gold_tree)
        total += 1
        if not chart:
            unparsed += 1
            res = tuple()
```

```
else:
                  try:
                      res = get_tree(chart,0,len(tokens),parser.grammar.startsymbol)
                  except KeyError:
                      unparsed += 1
                      res = tuple()
              print("predicted: ",res)
              #print(compute_parseval_scores(gold_tree, res))
              p,r,f = compute_parseval_scores(gold_tree, res)
              fscore sum += f
              print("P:{} R:{} F:{}".format(p,r,f))
              print()
          parsed = total-unparsed
          if parsed == 0:
              coverage = 0.0
              fscore_parsed = 0.0
              fscore_all = 0.0
          else:
              coverage = (parsed / total) *100
              fscore_parsed = fscore_sum / parsed
              fscore_all = fscore_sum / total
          print("Coverage: {:.2f}%, Average F-score (parsed sentences): {}, Average_
       →F-score (all sentences): {}".format(coverage, fscore parsed, fscore all))
      if __name__ == "__main__":
          if len(sys.arqv)!=3:
              print("USAGE: python evaluate parser.py [grammar file] [test file]")
              sys.exit(1)
          with open(sys.argv[1],'r') as grammar_file, open(sys.argv[2],'r') as \Box
       \hookrightarrow test file:
              grammar = Pcfg(grammar_file)
              parser = CkyParser(qrammar)
              evaluate_parser(parser, test_file)
      ,,,
[20]: '\nif name == " main ":\n\n if len(sys.argv)!=3:\n
                                                                         print("USAGE:
     python evaluate_parser.py [grammar_file] [test_file]")\n
                                                                      sys.exit(1)\n\n
      with open(sys.argv[1],\'r\') as grammar_file, open(sys.argv[2],\'r\') as
      test_file: \n
                      grammar = Pcfg(grammar_file) \n
      CkyParser(grammar)\n
                                  evaluate_parser(parser,test_file)\n'
[15]: with open('./atis3.pcfg','r') as grammar_file, open('./atis3_test.ptb','r') as__
      →test_file:
```

```
evaluate_parser(parser,test_file)
input: ['flights', 'from', 'los', 'angeles', 'to', 'pittsburgh', '.']
            ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
('NP', ('LOS', 'los'), ('ANGELES', 'angeles'))), ('PP', ('TO', 'to'), ('NP',
'pittsburgh')))), ('PUN', '.'))
predicted: ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
('NP', ('LOS', 'los'), ('ANGELES', 'angeles'))), ('PP', ('TO', 'to'), ('NP',
'pittsburgh')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['with', 'the', 'least', 'expensive', 'fare', '.']
            ('TOP', ('PP', ('WITH', 'with'), ('NP', ('THE', 'the'), ('NPBAR',
('ADJP', ('LEAST', 'least'), ('EXPENSIVE', 'expensive')), ('FARE', 'fare')))),
('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['flights', 'between', 'tampa', 'and', 'saint', 'louis', '.']
            ('TOP', ('NP', ('NP', 'flights'), ('PP', ('BETWEEN', 'between'),
('NP', ('NP', 'tampa'), ('NPBAR', ('AND', 'and'), ('NP', ('SAINT', 'saint'),
('LOUIS', 'louis'))))), ('PUN', '.'))
predicted: ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('BETWEEN',
'between'), ('NP', 'tampa')), ('NPBAR', ('AND', 'and'), ('NP', ('SAINT',
'saint'), ('LOUIS', 'louis'))))), ('PUN', '.'))
P:0.8461538461538461 R:0.8461538461538461 F:0.8461538461538461
input: ['i', "'d", 'like', 'a', 'flight', 'tomorrow', 'from', 'columbus', 'to',
'houston', 'with', 'a', 'stopover', 'in', 'nashville', '.']
            ('TOP', ('S', ('NP', 'i'), ('VP', ("'D", "'d"), ('VP', ('LIKE',
'like'), ('NP', ('NP', ('A', 'a'), ('FLIGHT', 'flight')), ('NPBAR', ('NP',
'tomorrow'), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', 'columbus')), ('NPBAR',
('PP', ('TO', 'to'), ('NP', 'houston')), ('PP', ('WITH', 'with'), ('NP', ('NP',
('A', 'a'), ('STOPOVER', 'stopover')), ('PP', ('IN', 'in'), ('NP',
'nashville')))))))))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['display', 'the', 'fare', 'codes', '.']
            ('TOP', ('VP', ('DISPLAY', 'display'), ('NP', ('THE', 'the'),
('NPBAR', ('FARE', 'fare'), ('CODES', 'codes')))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['what', 'flights', 'from', 'kansas', 'city', 'to', 'denver', '.']
```

grammar = Pcfg(grammar\_file)
parser = CkyParser(grammar)

```
target: ('TOP', ('WHNP', ('WHAT', 'what'), ('FLIGHTS', 'flights')),
('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', ('KANSAS', 'kansas'), ('CITY',
'city'))), ('PP', ('TO', 'to'), ('NP', 'denver')))), ('PUN', '.'))
predicted: ('TOP', ('WHNP', ('WHAT', 'what'), ('FLIGHTS', 'flights')),
('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', ('KANSAS', 'kansas'), ('CITY',
'city'))), ('PP', ('TO', 'to'), ('NP', 'denver')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['what', 'flights', 'from', 'minneapolis', 'to', 'pittsburgh', '.']
          ('TOP', ('WHNP', ('WHNP', ('WHAT', 'what'), ('FLIGHTS', 'flights')),
('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', 'minneapolis')), ('PP', ('TO',
'to'), ('NP', 'pittsburgh')))), ('PUN', '.'))
predicted: ('TOP', ('WHNP', ('WHNP', ('WHAT', 'what'), ('FLIGHTS', 'flights')),
('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', 'minneapolis')), ('PP', ('TO',
'to'), ('NP', 'pittsburgh')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['what', 'flights', 'from', 'tampa', 'to', 'cincinnati', '.']
            ('TOP', ('WHNP', ('WHNP', ('WHAT', 'what'), ('FLIGHTS', 'flights')),
('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', 'tampa')), ('PP', ('TO', 'to'),
('NP', 'cincinnati')))), ('PUN', '.'))
predicted: ('TOP', ('WHNP', ('WHAT', 'what'), ('FLIGHTS', 'flights')),
('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', 'tampa')), ('PP', ('TO', 'to'),
('NP', 'cincinnati')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['which', 'of', 'these', 'leave', 'after', 'noon', 'and', 'stop', 'in',
'phoenix', '.']
           ('TOP', ('SBARQ', ('WHNP', ('WHNP', 'which'), ('PP', ('OF', 'of'),
target:
('NP', 'these'))), ('VP', ('VP', ('LEAVE', 'leave'), ('PP', ('AFTER', 'after'),
('NP', 'noon'))), ('VPBAR', ('AND', 'and'), ('VP', ('STOP', 'stop'), ('PP',
('IN', 'in'), ('NP', 'phoenix'))))), ('PUN', '.'))
predicted: ('TOP', ('SBARQ', ('WHNP', ('WHNP', 'which'), ('PP', ('OF', 'of'),
('NP', 'these'))), ('VP', ('LEAVE', 'leave'), ('VPBAR', ('PP', ('AFTER',
'after'), ('NP', 'noon')), ('VPBAR', ('AND', 'and'), ('VP', ('STOP', 'stop'),
('PP', ('IN', 'in'), ('NP', 'phoenix')))))), ('PUN', '.'))
P:0.9523809523809523 R:0.9523809523809523 F:0.9523809523809523
input: ['flights', 'from', 'boston', 'to', 'pittsburgh', '.']
           ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
('NP', 'boston')), ('PP', ('TO', 'to'), ('NP', 'pittsburgh')))), ('PUN', '.'))
predicted: ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
('NP', 'boston')), ('PP', ('TO', 'to'), ('NP', 'pittsburgh')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['i', 'prefer', 'a', 'morning', 'flight', '.']
           ('TOP', ('S', ('NP', 'i'), ('VP', ('PREFER', 'prefer'), ('NP', ('A',
'a'), ('NPBAR', ('MORNING', 'morning'), ('FLIGHT', 'flight')))), ('PUN', '.'))
```

```
P:0.0 R:0.0 F:0.0
input: ['show', 'me', 'the', 'first', 'flight', 'that', 'arrives', 'in',
'toronto', 'from', 'cincinnati', '.']
          ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
('NP', ('THE', 'the'), ('NPBAR', ('FIRST', 'first'), ('FLIGHT', 'flight'))),
('NPBAR', ('SBAR', ('WHNP', 'that'), ('VP', ('ARRIVES', 'arrives'), ('PP',
('IN', 'in'), ('NP', 'toronto')))), ('PP', ('FROM', 'from'), ('NP',
'cincinnati')))))), ('PUN', '.'))
predicted: ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
('THE', 'the'), ('NPBAR', ('ADVP', 'first'), ('NP', ('NP', 'flight'), ('SBAR',
('WHNP', 'that'), ('VP', ('ARRIVES', 'arrives'), ('VPBAR', ('PP', ('IN', 'in'),
('NP', 'toronto')), ('PP', ('FROM', 'from'), ('NP', 'cincinnati'))))))))),
('PUN', '.'))
P:0.6956521739130435 R:0.6956521739130435 F:0.6956521739130435
input: ['which', 'of', 'these', 'is', 'last', '.']
target:
            ('TOP', ('SBARQ', ('WHNP', ('WHNP', 'which'), ('PP', ('OF', 'of'),
('NP', 'these'))), ('VP', ('IS', 'is'), ('ADJP', 'last'))), ('PUN', '.'))
predicted: ('TOP', ('SBARQ', ('WHNP', ('WHNP', 'which'), ('PP', ('OF', 'of'),
('NP', 'these'))), ('VP', ('IS', 'is'), ('ADJP', 'last'))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['i', "'d", 'like', 'a', 'flight', 'tomorrow', 'from', 'san', 'diego',
'to', 'toronto', '.']
            ('TOP', ('S', ('NP', 'i'), ('VP', ("'D", "'d"), ('VP', ('LIKE',
'like'), ('NP', ('NP', ('A', 'a'), ('FLIGHT', 'flight')), ('NPBAR', ('NP',
'tomorrow'), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', ('SAN', 'san'), ('DIEGO',
'diego'))), ('PP', ('TO', 'to'), ('NP', 'toronto'))))))), ('PUN', '.'))
predicted: ('TOP', ('S', ('NP', 'i'), ('VP', ("'D", "'d"), ('VP', ('LIKE',
'like'), ('NP', ('NP', ('A', 'a'), ('FLIGHT', 'flight')), ('NP', ('NP',
'tomorrow'), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', ('SAN', 'san'), ('DIEGO',
'diego'))), ('PP', ('TO', 'to'), ('NP', 'toronto'))))))), ('PUN', '.'))
P:0.9565217391304348 R:0.9565217391304348 F:0.9565217391304348
input: ['which', 'of', 'those', 'leave', 'before', 'eight', 'a.m', '.']
          ('TOP', ('SBARQ', ('WHNP', ('WHNP', 'which'), ('PP', ('OF', 'of'),
('NP', 'those'))), ('VP', ('LEAVE', 'leave'), ('PP', ('BEFORE', 'before'),
('NP', ('EIGHT', 'eight'), ('A.M', 'a.m'))))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['what', 'airlines', 'from', 'washington', 'd', 'c', 'to', 'columbus',
'.']
target:
          ('TOP', ('FRAG', ('WHNP', ('WHAT', 'what'), ('AIRLINES',
'airlines')), ('FRAGBAR', ('PP', ('FROM', 'from'), ('NP', ('NP', 'washington'),
('NP', ('D', 'd'), ('C', 'c')))), ('PP', ('TO', 'to'), ('NP', 'columbus')))),
```

predicted: ()

```
('PUN', '.'))
predicted: ('TOP', ('WHNP', ('WHNP', ('WHAT', 'what'), ('AIRLINES',
'airlines')), ('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', ('NP', 'washington'),
('NP', ('D', 'd'), ('C', 'c')))), ('PP', ('TO', 'to'), ('NP', 'columbus')))),
('PUN', '.'))
P:0.8823529411764706 R:0.8823529411764706 F:0.8823529411764706
input: ['what', 'flights', 'from', 'chicago', 'to', 'kansas', 'city', 'in',
'the', 'morning', '.']
          ('TOP', ('WHNP', ('NP', ('WHAT', 'what'), ('FLIGHTS', 'flights')),
target:
('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', 'chicago')), ('WHNPBAR', ('PP',
('TO', 'to'), ('NP', ('KANSAS', 'kansas'), ('CITY', 'city'))), ('PP', ('IN',
'in'), ('NP', ('THE', 'the'), ('MORNING', 'morning')))))), ('PUN', '.'))
predicted: ('TOP', ('WHNP', ('WHAT', 'what'), ('FLIGHTS', 'flights')),
('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', 'chicago')), ('WHNPBAR', ('PP',
('TO', 'to'), ('NP', ('KANSAS', 'kansas'), ('CITY', 'city'))), ('PP', ('IN',
'in'), ('NP', ('THE', 'the'), ('MORNING', 'morning')))))), ('PUN', '.'))
P:0.9523809523809523 R:0.9523809523809523 F:0.9523809523809523
input: ['what', 'type', 'of', 'aircraft', 'is', 'used', 'on', 'those',
'flights', '.']
            ('TOP', ('SBARQ', ('WHNP', ('WHNP', ('WHAT', 'what'), ('TYPE',
target:
'type')), ('PP', ('OF', 'of'), ('NP', 'aircraft'))), ('VP', ('IS', 'is'), ('VP',
('USED', 'used'), ('PP', ('ON', 'on'), ('NP', ('THOSE', 'those'), ('FLIGHTS',
'flights')))))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['price', 'of', 'flight', 'a', 'a', 'one', 'thousand', 'three',
'hundred', 'nineteen', '.']
           ('TOP', ('NP', ('NP', 'price'), ('PP', ('OF', 'of'), ('NP',
target:
('FLIGHT', 'flight'), ('NPBAR', ('A', 'a'), ('NPBAR', ('A', 'a'), ('NPBAR',
('ONE', 'one'), ('NPBAR', ('THOUSAND', 'thousand'), ('NPBAR', ('THREE',
'three'), ('NPBAR', ('HUNDRED', 'hundred'), ('NINETEEN', 'nineteen'))))))))),
('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['show', 'me', 'the', 'ground', 'transportation', 'available', '.']
            ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
('NP', ('THE', 'the'), ('NPBAR', ('GROUND', 'ground'), ('TRANSPORTATION',
'transportation'))), ('ADJP', 'available')))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['which', 'is', 'the', 'latest', '.']
target:
            ('TOP', ('SBARQ', ('WHNP', 'which'), ('VP', ('IS', 'is'), ('NP',
('THE', 'the'), ('LATEST', 'latest')))), ('PUN', '.'))
```

```
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['what', 'about', 'after', 'seven', 'p.m', '.']
            ('TOP', ('FRAG', ('X', ('WHAT', 'what'), ('ABOUT', 'about')), ('PP',
('AFTER', 'after'), ('NP', ('SEVEN', 'seven'), ('P.M', 'p.m')))), ('PUN', '.'))
predicted: ('TOP', ('FRAG', ('X', ('WHAT', 'what'), ('ABOUT', 'about')), ('PP',
('AFTER', 'after'), ('NP', ('SEVEN', 'seven'), ('P.M', 'p.m')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['what', 'flights', 'from', 'salt', 'lake', 'city', 'to', 'las',
'vegas', '.']
          ('TOP', ('FRAG', ('WHNP', ('WHNP', ('WHAT', 'what'), ('FLIGHTS',
target:
'flights')), ('PP', ('FROM', 'from'), ('NP', ('SALT', 'salt'), ('NPBAR',
('LAKE', 'lake'), ('CITY', 'city'))))), ('PP', ('TO', 'to'), ('NP', ('LAS',
'las'), ('VEGAS', 'vegas')))), ('PUN', '.'))
predicted: ('TOP', ('WHNP', ('WHAT', 'what'), ('FLIGHTS', 'flights')),
('WHNPBAR', ('PP', ('FROM', 'from'), ('NP', ('SALT', 'salt'), ('NPBAR', ('LAKE',
'lake'), ('CITY', 'city')))), ('PP', ('TO', 'to'), ('NP', ('LAS', 'las'),
('VEGAS', 'vegas'))))), ('PUN', '.'))
P:0.8947368421052632 R:0.8947368421052632 F:0.8947368421052632
input: ['flights', 'after', 'twelve', 'hundred', 'hours', '.']
target:
           ('TOP', ('NP', ('NP', 'flights'), ('PP', ('AFTER', 'after'), ('NP',
('TWELVE', 'twelve'), ('NPBAR', ('HUNDRED', 'hundred'), ('HOURS', 'hours'))))),
('PUN', '.'))
predicted: ('TOP', ('FRAG', ('NP', 'flights'), ('PP', ('AFTER', 'after'),
('NP', ('TWELVE', 'twelve'), ('NPBAR', ('HUNDRED', 'hundred'), ('HOURS',
'hours'))))), ('PUN', '.'))
P:0.909090909090901 R:0.90909090909091 F:0.90909090909091
input: ['what', 'is', 'the', 'price', 'of', 'united', 'airlines', 'flight',
'nine', 'seven', '.']
          ('TOP', ('SBARQ', ('WHNP', 'what'), ('SQ', ('IS', 'is'), ('NP',
('NP', ('THE', 'the'), ('PRICE', 'price')), ('PP', ('OF', 'of'), ('NP',
('UNITED', 'united'), ('NPBAR', ('AIRLINES', 'airlines'), ('NPBAR', ('FLIGHT',
'flight'), ('NPBAR', ('NINE', 'nine'), ('SEVEN', 'seven')))))))), ('PUN', '.'))
predicted: ('TOP', ('SBARQ', ('WHNP', 'what'), ('SQ', ('IS', 'is'), ('NP',
('NP', ('THE', 'the'), ('PRICE', 'price')), ('NPBAR', ('PP', ('OF', 'of'),
('NP', ('UNITED', 'united'), ('AIRLINES', 'airlines'))), ('NPBAR', ('FLIGHT',
'flight'), ('NPBAR', ('NINE', 'nine'), ('SEVEN', 'seven')))))), ('PUN', '.'))
P:0.8571428571428571 R:0.8571428571428571 F:0.8571428571428571
input: ['cheapest', 'airfare', 'from', 'orlando', 'to', 'tacoma', '.']
            ('TOP', ('NP', ('NP', ('CHEAPEST', 'cheapest'), ('AIRFARE',
'airfare')), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', 'orlando')), ('PP',
('TO', 'to'), ('NP', 'tacoma')))), ('PUN', '.'))
predicted: ('TOP', ('NP', ('NP', ('CHEAPEST', 'cheapest'), ('AIRFARE',
```

```
'airfare')), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', 'orlando')), ('PP',
('TO', 'to'), ('NP', 'tacoma')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['price', 'of', 'flight', 'from', 'cleveland', 'to', 'nashville', '.']
            ('TOP', ('NP', ('NP', 'price'), ('PP', ('OF', 'of'), ('NP', ('NP',
'flight'), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', 'cleveland')), ('PP',
('TO', 'to'), ('NP', 'nashville')))))), ('PUN', '.'))
predicted: ('TOP', ('FRAG', ('NP', 'price'), ('PP', ('OF', 'of'), ('NP',
('FLIGHT', 'flight'), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', 'cleveland')),
('PP', ('TO', 'to'), ('NP', 'nashville')))))), ('PUN', '.'))
P:0.86666666666666 R:0.86666666666 F:0.86666666666666
input: ['what', 'is', 'the', 'price', '.']
            ('TOP', ('SBARQ', ('WHNP', 'what'), ('SQ', ('IS', 'is'), ('NP',
('THE', 'the'), ('PRICE', 'price')))), ('PUN', '.'))
predicted: ('TOP', ('SBARQ', ('WHNP', 'what'), ('SQ', ('IS', 'is'), ('NP',
('THE', 'the'), ('PRICE', 'price')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['what', 'is', 'the', 'price', 'of', 'flights', 'from', 'indianapolis',
'to', 'memphis', '.']
           ('TOP', ('SBARQ', ('WHNP', 'what'), ('SQ', ('IS', 'is'), ('NP',
('NP', ('THE', 'the'), ('PRICE', 'price')), ('PP', ('OF', 'of'), ('NP', ('NP',
'flights'), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', 'indianapolis')), ('PP',
('TO', 'to'), ('NP', 'memphis'))))))), ('PUN', '.'))
predicted: ('TOP', ('SBARQ', ('WHNP', 'what'), ('SQ', ('IS', 'is'), ('NP',
('NP', ('THE', 'the'), ('PRICE', 'price')), ('NPBAR', ('PP', ('OF', 'of'),
('NP', 'flights')), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', 'indianapolis')),
('PP', ('TO', 'to'), ('NP', 'memphis')))))), ('PUN', '.'))
P:0.9047619047619048 R:0.9047619047619048 F:0.9047619047619048
input: ['show', 'me', 'the', 'flights', 'from', 'newark', 'new', 'jersey',
'to', 'ontario', 'international', 'next', 'saturday', '.']
            ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
('NP', ('THE', 'the'), ('FLIGHTS', 'flights')), ('NPBAR', ('PP', ('FROM',
'from'), ('NP', ('NP', 'newark'), ('NP', ('NEW', 'new'), ('JERSEY',
'jersey')))), ('NPBAR', ('PP', ('TO', 'to'), ('NP', ('ONTARIO', 'ontario'),
('INTERNATIONAL', 'international'))), ('NP', ('NEXT', 'next'), ('SATURDAY',
'saturday')))))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['what', 'flights', 'leave', 'phoenix', 'on', 'wednesday', '.']
            ('TOP', ('SBARQ', ('WHNP', ('WHAT', 'what'), ('FLIGHTS',
'flights')), ('VP', ('LEAVE', 'leave'), ('VPBAR', ('NP', 'phoenix'), ('PP',
('ON', 'on'), ('NP', 'wednesday'))))), ('PUN', '.'))
predicted: ('TOP', ('SBARQ', ('WHNP', ('WHAT', 'what'), ('FLIGHTS',
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'flights')), ('VP', ('LEAVE', 'leave'), ('VPBAR', ('NP', 'phoenix'), ('PP',
('ON', 'on'), ('NP', 'wednesday'))))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['show', 'me', 'the', 'meal', '.']
           ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
('THE', 'the'), ('MEAL', 'meal')))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['show', 'business', 'class', 'fares', '.']
            ('TOP', ('VP', ('SHOW', 'show'), ('NP', ('BUSINESS', 'business'),
('NPBAR', ('CLASS', 'class'), ('FARES', 'fares')))), ('PUN', '.'))
predicted: ('TOP', ('VP', ('SHOW', 'show'), ('NP', ('BUSINESS', 'business'),
('NPBAR', ('CLASS', 'class'), ('FARES', 'fares')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['i', 'have', 'a', 'friend', 'living', 'in', 'denver', 'that', 'would',
'like', 'to', 'visit', 'me', 'here', 'in', 'washington', 'd', 'c', '.']
target: ('TOP', ('S', ('NP', 'i'), ('VP', ('HAVE', 'have'), ('NP', ('NP',
('A', 'a'), ('FRIEND', 'friend')), ('NPBAR', ('VP', ('LIVING', 'living'), ('PP',
('IN', 'in'), ('NP', 'denver'))), ('SBAR', ('WHNP', 'that'), ('VP', ('WOULD',
'would'), ('VP', ('LIKE', 'like'), ('VP', ('TO', 'to'), ('VP', ('VISIT',
'visit'), ('VPBAR', ('NP', 'me'), ('ADVP', ('ADVP', 'here'), ('PP', ('IN',
'in'), ('NP', ('NP', 'washington'), ('NP', ('D', 'd'), ('C', 'c')))))))))))))
('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['cheapest', '.']
            ('TOP', ('ADJP', 'cheapest'), ('PUN', '.'))
target:
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['list', 'nonstop', 'flights', 'from', 'burbank', 'to', 'denver',
'arriving', 'by', 'six', 'p.m', '.']
           ('TOP', ('VP', ('LIST', 'list'), ('NP', ('NP', ('NONSTOP',
'nonstop'), ('FLIGHTS', 'flights')), ('NPBAR', ('PP', ('FROM', 'from'), ('NP',
'burbank')), ('NPBAR', ('PP', ('TO', 'to'), ('NP', 'denver')), ('VP',
('ARRIVING', 'arriving'), ('PP', ('BY', 'by'), ('NP', ('SIX', 'six'), ('P.M',
'p.m'))))))), ('PUN', '.'))
predicted: ('TOP', ('VP', ('LIST', 'list'), ('NP', ('NP', ('NONSTOP',
'nonstop'), ('FLIGHTS', 'flights')), ('NPBAR', ('PP', ('FROM', 'from'), ('NP',
'burbank')), ('NPBAR', ('PP', ('TO', 'to'), ('NP', 'denver')), ('VP',
('ARRIVING', 'arriving'), ('PP', ('BY', 'by'), ('NP', ('SIX', 'six'), ('P.M',
'p.m'))))))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
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input: ['shortest', 'morning', 'flights', 'from', 'cincinnati', 'to', 'tampa',
'.']
            ('TOP', ('NP', ('NP', ('SHORTEST', 'shortest'), ('NPBAR',
target:
('MORNING', 'morning'), ('FLIGHTS', 'flights'))), ('NPBAR', ('PP', ('FROM',
'from'), ('NP', 'cincinnati')), ('PP', ('TO', 'to'), ('NP', 'tampa')))), ('PUN',
'.'))
predicted: ('TOP', ('NP', ('NP', ('SHORTEST', 'shortest'), ('NPBAR'.
('MORNING', 'morning'), ('FLIGHTS', 'flights'))), ('NPBAR', ('PP', ('FROM',
'from'), ('NP', 'cincinnati')), ('PP', ('TO', 'to'), ('NP', 'tampa')))), ('PUN',
'.'))
P:1.0 R:1.0 F:1.0
input: ['flights', 'from', 'kansas', 'city', 'to', 'cleveland', '.']
            ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
('NP', ('KANSAS', 'kansas'), ('CITY', 'city'))), ('PP', ('TO', 'to'), ('NP',
'cleveland')))), ('PUN', '.'))
predicted: ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
('NP', ('KANSAS', 'kansas'), ('CITY', 'city'))), ('PP', ('TO', 'to'), ('NP',
'cleveland')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['from', 'toronto', 'to', 'atlanta', 'in', 'the', 'afternoon', '.']
            ('TOP', ('FRAG', ('PP', ('FROM', 'from'), ('NP', 'toronto')),
('FRAGBAR', ('PP', ('TO', 'to'), ('NP', 'atlanta')), ('PP', ('IN', 'in'), ('NP',
('THE', 'the'), ('AFTERNOON', 'afternoon'))))), ('PUN', '.'))
predicted: ('TOP', ('FRAG', ('PP', ('FROM', 'from'), ('NP', 'toronto')),
('FRAGBAR', ('PP', ('TO', 'to'), ('NP', 'atlanta')), ('PP', ('IN', 'in'), ('NP',
('THE', 'the'), ('AFTERNOON', 'afternoon'))))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['now', 'i', 'need', 'a', 'flight', 'on', 'tuesday', 'from', 'phoenix',
'to', 'detroit', '.']
            ('TOP', ('S', ('ADVP', 'now'), ('SBAR', ('NP', 'i'), ('VP', ('NEED',
target:
'need'), ('NP', ('NP', ('A', 'a'), ('FLIGHT', 'flight')), ('NPBAR', ('PP',
('ON', 'on'), ('NP', 'tuesday')), ('NPBAR', ('PP', ('FROM', 'from'), ('NP',
'phoenix')), ('PP', ('TO', 'to'), ('NP', 'detroit'))))))), ('PUN', '.'))
predicted: ('TOP', ('S', ('ADVP', 'now'), ('SBAR', ('NP', 'i'), ('VP', ('NEED',
'need'), ('NP', ('NP', ('A', 'a'), ('FLIGHT', 'flight')), ('NPBAR', ('PP',
('ON', 'on'), ('NP', 'tuesday')), ('NPBAR', ('PP', ('FROM', 'from'), ('NP',
'phoenix')), ('PP', ('TO', 'to'), ('NP', 'detroit'))))))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['i', 'need', 'a', 'flight', 'the', 'next', 'day', 'from', 'newark',
'to', 'orlando', '.']
            ('TOP', ('S', ('NP', 'i'), ('VP', ('NEED', 'need'), ('NP', ('NP',
('A', 'a'), ('FLIGHT', 'flight')), ('NPBAR', ('NP', ('THE', 'the'), ('NPBAR',
('NEXT', 'next'), ('DAY', 'day'))), ('NPBAR', ('PP', ('FROM', 'from'), ('NP',
'newark')), ('PP', ('TO', 'to'), ('NP', 'orlando')))))), ('PUN', '.'))
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predicted: ('TOP', ('S', ('NP', 'i'), ('VP', ('NEED', 'need'), ('NP', ('NP',
('A', 'a'), ('FLIGHT', 'flight')), ('NP', ('NP', ('THE', 'the'), ('NPBAR',
('NEXT', 'next'), ('DAY', 'day'))), ('NPBAR', ('PP', ('FROM', 'from'), ('NP',
'newark')), ('PP', ('TO', 'to'), ('NP', 'orlando')))))), ('PUN', '.'))
P:0.9565217391304348 R:0.9565217391304348 F:0.9565217391304348
input: ['flights', 'from', 'pittsburgh', 'to', 'newark', '.']
           ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
target:
('NP', 'pittsburgh')), ('PP', ('TO', 'to'), ('NP', 'newark')))), ('PUN', '.'))
predicted: ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
('NP', 'pittsburgh')), ('PP', ('TO', 'to'), ('NP', 'newark')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['what', 'is', 'airline', 'f', 'f', '.']
           ('TOP', ('SBARQ', ('WHNP', 'what'), ('SQ', ('IS', 'is'), ('NP',
('AIRLINE', 'airline'), ('NPBAR', ('F', 'f'), ('F', 'f')))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['julysixteenth', 'please', '.']
         ('TOP', ('FRAG', ('NP', 'julysixteenth'), ('INTJ', 'please')),
('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['airports', 'in', 'new', 'york', '.']
           ('TOP', ('NP', ('NP', 'airports'), ('PP', ('IN', 'in'), ('NP',
('NEW', 'new'), ('YORK', 'york')))), ('PUN', '.'))
predicted: ('TOP', ('FRAG', ('NP', 'airports'), ('PP', ('IN', 'in'), ('NP',
('NEW', 'new'), ('YORK', 'york')))), ('PUN', '.'))
input: ['show', 'me', 'the', 'flights', 'from', 'baltimore', 'to', 'seattle',
'.']
           ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
target:
('NP', ('THE', 'the'), ('FLIGHTS', 'flights')), ('NPBAR', ('PP', ('FROM',
'from'), ('NP', 'baltimore')), ('PP', ('TO', 'to'), ('NP', 'seattle')))))),
('PUN', '.'))
predicted: ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
('NP', ('THE', 'the'), ('FLIGHTS', 'flights')), ('NPBAR', ('PP', ('FROM',
'from'), ('NP', 'baltimore')), ('PP', ('TO', 'to'), ('NP', 'seattle')))))),
('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['friday', 'afternoon', '.']
target:
           ('TOP', ('NP', ('FRIDAY', 'friday'), ('AFTERNOON', 'afternoon')),
('PUN', '.'))
predicted: ('TOP', ('NP', ('FRIDAY', 'friday'), ('AFTERNOON', 'afternoon')),
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('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['how', 'many', 'stops', 'are', 'there', '.']
            ('TOP', ('SBAR', ('WHNP', ('WHADJP', ('HOW', 'how'), ('MANY',
'many')), ('STOPS', 'stops')), ('SQ', ('ARE', 'are'), ('NP', 'there'))), ('PUN',
'.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['flights', 'from', 'pittsburgh', 'to', 'los', 'angeles', 'thursday',
'evening', '.']
           ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
target:
('NP', 'pittsburgh')), ('NPBAR', ('PP', ('TO', 'to'), ('NP', ('LOS', 'los'),
('ANGELES', 'angeles'))), ('NP', ('THURSDAY', 'thursday'), ('EVENING',
'evening'))))), ('PUN', '.'))
predicted: ('TOP', ('FRAG', ('NP', 'flights'), ('FRAGBAR', ('PP', ('FROM',
'from'), ('NP', 'pittsburgh')), ('FRAGBAR', ('PP', ('TO', 'to'), ('NP', ('LOS',
'los'), ('ANGELES', 'angeles'))), ('NP', ('THURSDAY', 'thursday'), ('EVENING',
'evening'))))), ('PUN', '.'))
P:0.8235294117647058 R:0.8235294117647058 F:0.8235294117647058
input: ['show', 'me', 'thelatestflight', 'from', 'salt', 'lake', 'city', 'to',
'phoenix', '.']
            ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
target:
('NP', 'thelatestflight'), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', ('SALT',
'salt'), ('NPBAR', ('LAKE', 'lake'), ('CITY', 'city')))), ('PP', ('TO', 'to'),
('NP', 'phoenix'))))), ('PUN', '.'))
predicted: ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
('NP', 'thelatestflight'), ('NPBAR', ('PP', ('FROM', 'from'), ('NP', ('SALT',
'salt'), ('NPBAR', ('LAKE', 'lake'), ('CITY', 'city')))), ('PP', ('TO', 'to'),
('NP', 'phoenix'))))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['of', 'those', 'flights', 'which', 'ones', 'stop', 'in', 'minneapolis',
'.']
           ('TOP', ('SBARQ', ('PP', ('OF', 'of'), ('NP', ('THOSE', 'those'),
('FLIGHTS', 'flights'))), ('SBARQBAR', ('WHNP', ('WHICH', 'which'), ('ONES',
'ones')), ('VP', ('STOP', 'stop'), ('PP', ('IN', 'in'), ('NP',
'minneapolis'))))), ('PUN', '.'))
predicted: ('TOP', ('S', ('PP', ('OF', 'of'), ('NP', ('NP', 'those'),
('FLIGHTS', 'flights'))), ('SBAR', ('WHNP', ('WHICH', 'which'), ('ONES',
'ones')), ('VP', ('STOP', 'stop'), ('PP', ('IN', 'in'), ('NP',
'minneapolis'))))), ('PUN', '.'))
P:0.8235294117647058 R:0.8235294117647058 F:0.8235294117647058
input: ['tuesday', '.']
          ('TOP', ('NP', 'tuesday'), ('PUN', '.'))
target:
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predicted: ('TOP', ('NP', 'tuesday'), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['flights', 'from', 'miami', 'to', 'cleveland', '.']
            ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
('NP', 'miami')), ('PP', ('TO', 'to'), ('NP', 'cleveland')))), ('PUN', '.'))
predicted: ('TOP', ('NP', ('NP', 'flights'), ('NPBAR', ('PP', ('FROM', 'from'),
('NP', 'miami')), ('PP', ('TO', 'to'), ('NP', 'cleveland')))), ('PUN', '.'))
P:1.0 R:1.0 F:1.0
input: ['what', 'is', 'b', 'n', 'a', '.']
           ('TOP', ('SBARQ', ('WHNP', 'what'), ('SQ', ('IS', 'is'), ('NP',
('B', 'b'), ('NPBAR', ('N', 'n'), ('A', 'a'))))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['show', 'me', 'the', 'flights', 'that', 'accept', 'frequent', 'flyer',
'tickets', '.']
target:
            ('TOP', ('VP', ('SHOW', 'show'), ('VPBAR', ('NP', 'me'), ('NP',
('NP', ('THE', 'the'), ('FLIGHTS', 'flights')), ('SBAR', ('WHNP', 'that'),
('VP', ('ACCEPT', 'accept'), ('NP', ('FREQUENT', 'frequent'), ('NPBAR',
('FLYER', 'flyer'), ('TICKETS', 'tickets'))))))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
input: ['which', 'flights', 'depart', 'burbank', 'between', 'twelve', 'noon',
'and', 'six', 'p.m', '.']
           ('TOP', ('SBARQ', ('WHNP', ('WHICH', 'which'), ('FLIGHTS',
'flights')), ('VP', ('DEPART', 'depart'), ('VPBAR', ('NP', 'burbank'), ('PP',
('BETWEEN', 'between'), ('NP', ('NP', ('TWELVE', 'twelve'), ('NOON', 'noon')),
('NPBAR', ('AND', 'and'), ('NP', ('SIX', 'six'), ('P.M', 'p.m'))))))), ('PUN',
predicted: ('TOP', ('SBARQ', ('WHNP', ('WHICH', 'which'), ('FLIGHTS',
'flights')), ('VP', ('DEPART', 'depart'), ('NP', ('NP', 'burbank'), ('NPBAR',
('PP', ('BETWEEN', 'between'), ('NP', ('TWELVE', 'twelve'), ('NOON', 'noon'))),
('NPBAR', ('AND', 'and'), ('NP', ('SIX', 'six'), ('P.M', 'p.m')))))), ('PUN',
P:0.8571428571428571 R:0.8571428571428571 F:0.8571428571428571
input: ['i', 'need', 'a', 'flight', 'from', 'kansas', 'city', 'to', 'newark',
'on', 'the', 'first', 'of', 'july', '.']
          ('TOP', ('S', ('NP', 'i'), ('VP', ('NEED', 'need'), ('NP', ('NP',
('A', 'a'), ('FLIGHT', 'flight')), ('NPBAR', ('PP', ('FROM', 'from'), ('NP',
('KANSAS', 'kansas'), ('CITY', 'city'))), ('NPBAR', ('PP', ('TO', 'to'), ('NP',
'newark')), ('PP', ('ON', 'on'), ('NP', ('NP', ('THE', 'the'), ('FIRST',
'first')), ('PP', ('OF', 'of'), ('NP', 'july')))))))), ('PUN', '.'))
predicted: ()
P:0.0 R:0.0 F:0.0
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input: ['what', 'flights', 'are', 'there', 'from', 'new', 'york', 'to', 'las',
    'vegas', '.']
    target:
                ('TOP', ('SBARQ', ('WHNP', ('WHAT', 'what'), ('FLIGHTS',
    'flights')), ('SQ', ('ARE', 'are'), ('SQBAR', ('NP', 'there'), ('SQBAR', ('PP',
    ('FROM', 'from'), ('NP', ('NEW', 'new'), ('YORK', 'york'))), ('PP', ('TO',
    'to'), ('NP', ('LAS', 'las'), ('VEGAS', 'vegas'))))))), ('PUN', '.'))
    predicted: ('TOP', ('SBARQ', ('WHNP', ('WHAT', 'what'), ('FLIGHTS',
    'flights')), ('SQ', ('ARE', 'are'), ('SQBAR', ('NP', 'there'), ('SQBAR', ('PP',
    ('FROM', 'from'), ('NP', ('NEW', 'new'), ('YORK', 'york'))), ('PP', ('TO',
    'to'), ('NP', ('LAS', 'las'), ('VEGAS', 'vegas'))))))), ('PUN', '.'))
    P:1.0 R:1.0 F:1.0
    Coverage: 67.24%, Average F-score (parsed sentences): 0.9504475408614075,
    Average F-score (all sentences): 0.6390940360964636
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