

## Natural Language Processing

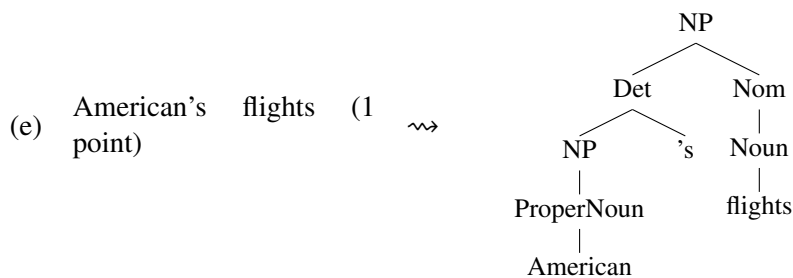
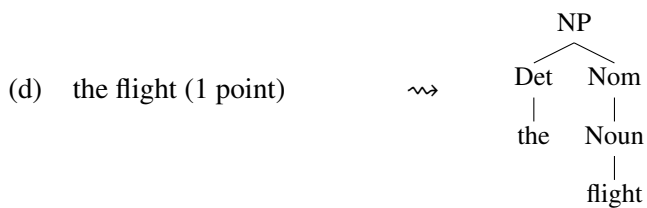
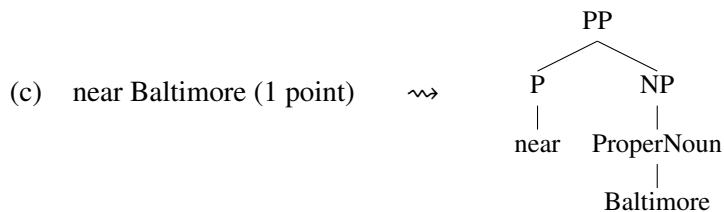
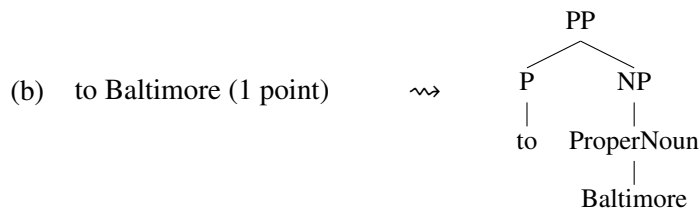
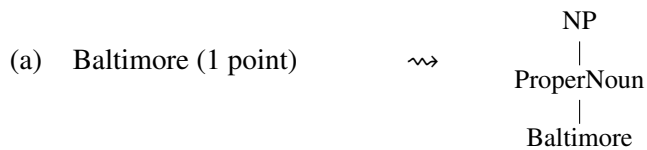
### Course Work 2: Formal Grammars and Parsing

Based on chapters 11,12,13 of Jurafsky and Martin

Posted on February 18th 2018, Due on 11th of March 2018

Please submit via QMPlus.

1. Use any of the rules provided in Chapter 11 (or 12 in the 2nd edition) of the Jurafsky and Martin book (available on the QMPlus webpage of the course) to draw CFG parse trees for the following phrases. In each case list the rules that you used and a page number in which the rule is presented.



- (f) morning flight (1 point)  $\rightsquigarrow$
- ```

      Nom
     /  \
    Nom  Noun
    |    |
    Noun flight
    |
  morning
  
```
- (g) one flight (1 point)  $\rightsquigarrow$
- ```

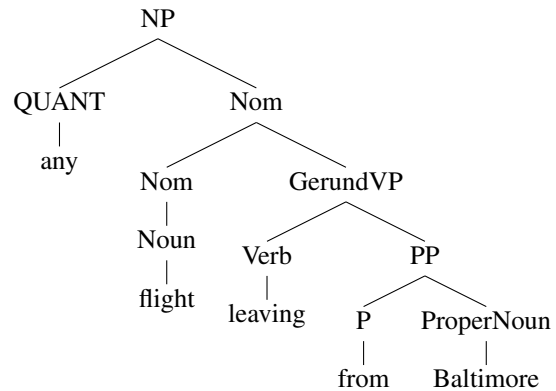
      NP
     /  \
    CARD Nom
    |    |
    one  Noun
         |
        flight
  
```
- (h) any flight (1 point)  $\rightsquigarrow$
- ```

      NP
     /  \
    QUANT Nom
    |    |
    any  Noun
         |
        flight
  
```
- (i) any morning flight from Baltimore (2 points)  $\rightsquigarrow$
- ```

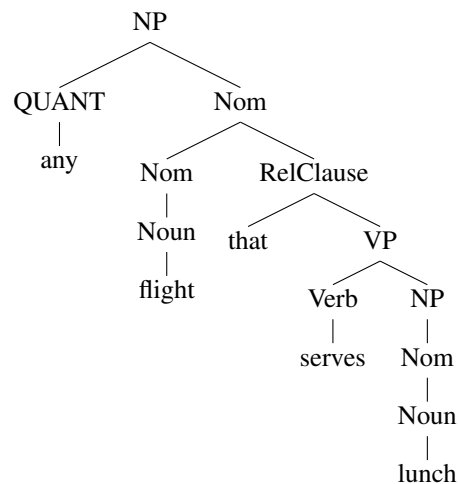
      NP
     /  \
    QUANT Nom
    |    /  \
    any Nom  PP
        /  \ /  \
       Nom Noun P  NP
       |   |   |   |
       Noun flight from ProperNoun
       |
      morning
                   |
                  Baltimore
  
```
- (j) United's flight to Baltimore (2 points)  $\rightsquigarrow$
- ```

      NP
     /  \
    Det  Nom
   /  \ /  \
  NP  's Nom  PP
  |   | /  \ /  \
 ProperNoun Noun P  NP
   |         |   |   |
   United flights to ProperNoun
                   |
                  Baltimore
  
```

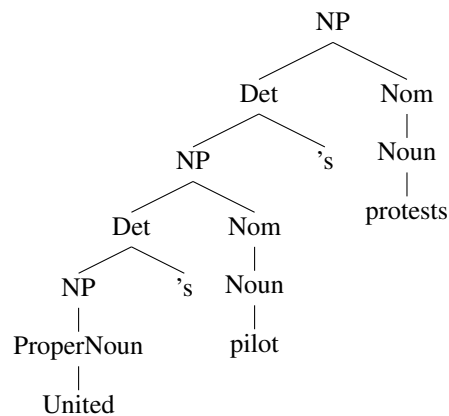
(k) any flight leaving from Baltimore (2 points)  $\rightsquigarrow$



(l) any flight that serves lunch (2 points)  $\rightsquigarrow$

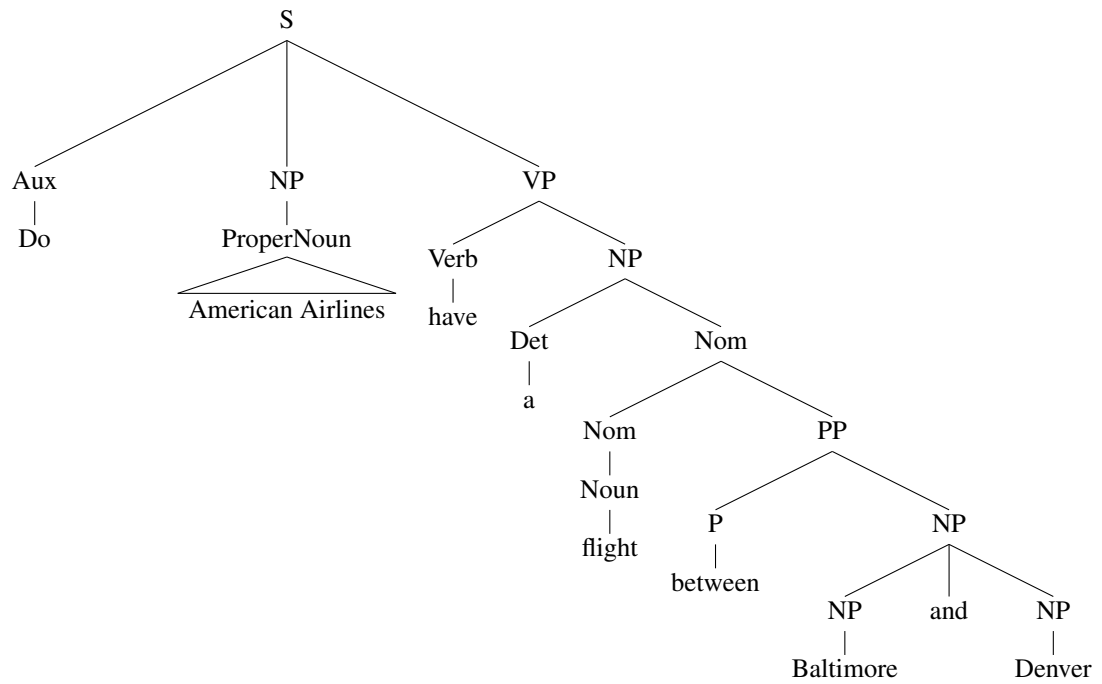


(m) United's pilot's protests (4 points)  $\rightsquigarrow$

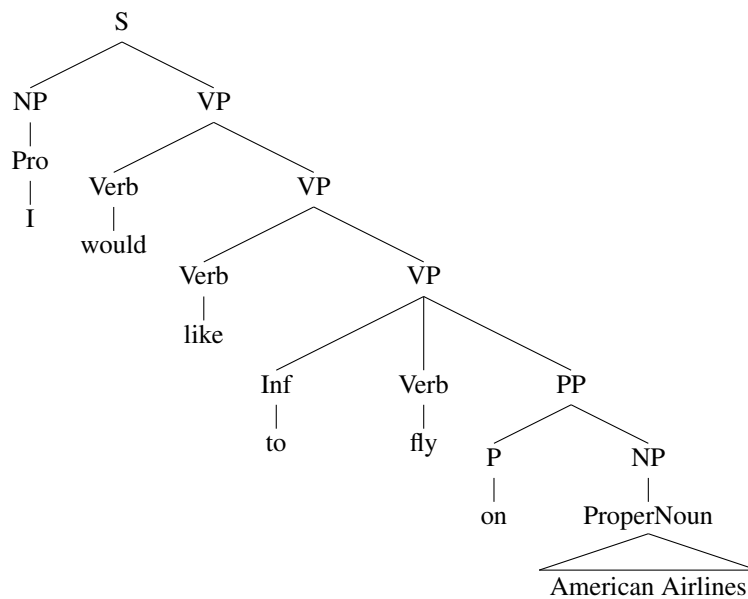


2. Do the same as in Question 1, following the same procedure, but now for the following sentences: (22 points)

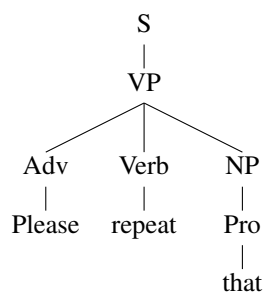
(a) Do American Airlines have a flight between Baltimore and Denver? (3 points)



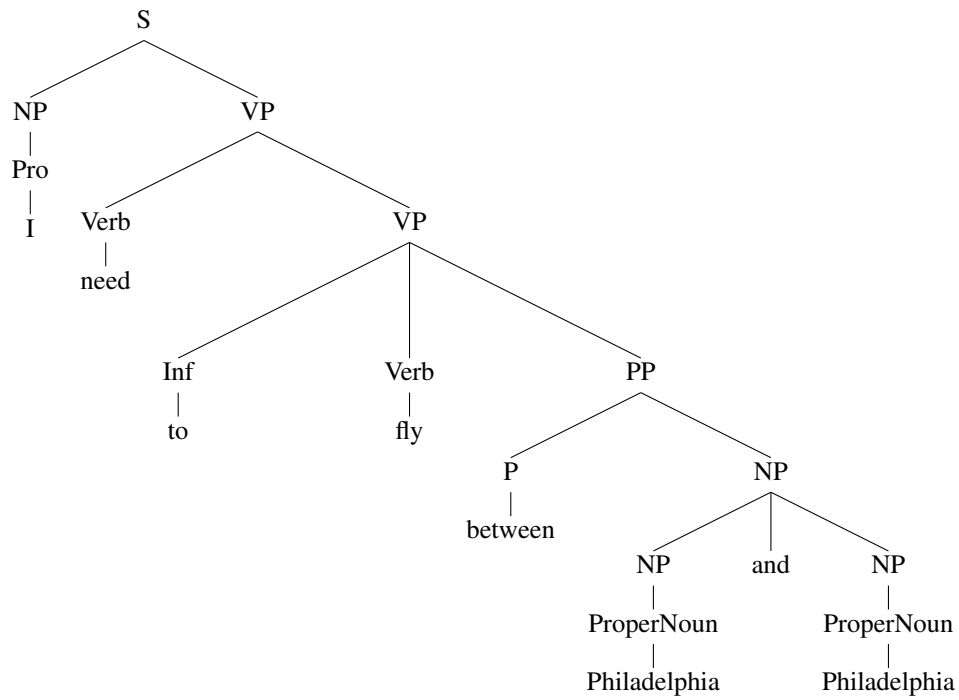
(b) I would like to fly on American airlines. (4 points)



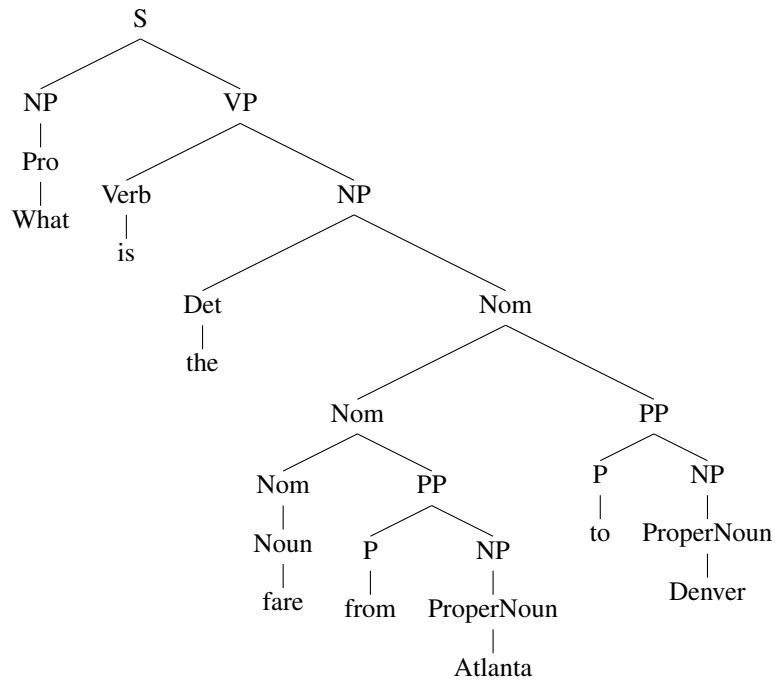
(c) Please repeat that. (5 points)



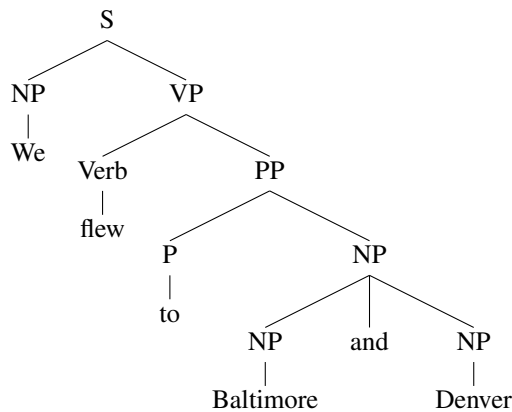
(d) I need to fly between Philadelphia and Atlanta. (3 points)



(e) What is the fare from Atlanta to Denver? (4 points)



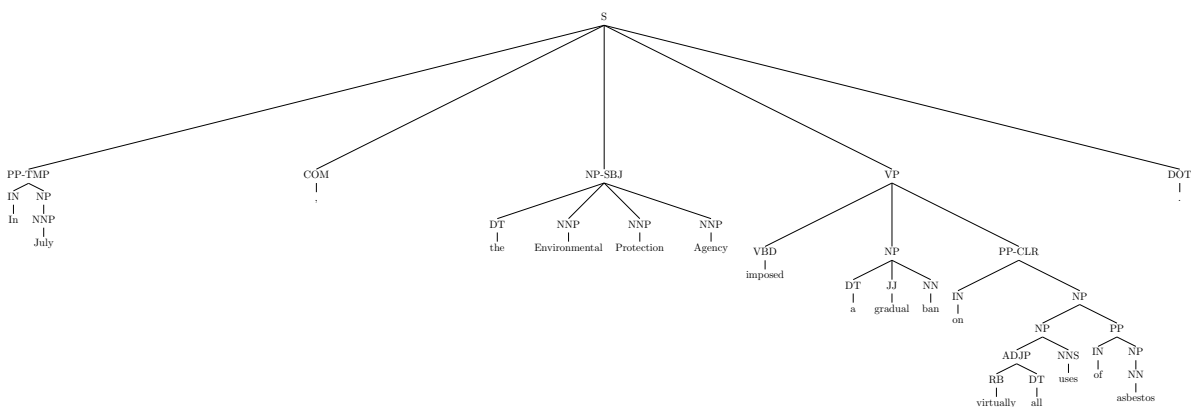
(f) We flew to Baltimore and Denver. (3 points)



3. The provided script `grammar_script.py` contains three parsed sentences from the Penn Treebank. Using this script, draw the CFG parse trees (4 points for the first and last trees, 2 points for the second tree) for these sentences and extract the set of CFG rules that are needed to parse the original sentences (2 points for the first and last trees, 1 point for the second tree). Do not use any NLTK routines, beside those given in the script. (15 points)

*Solution: please see `grammar_sol.py`. We give the trees and the rules per tree:*

(a) *In July*



*Rules:*

$S \rightarrow PP-TMP, NP-SBJ VP.$

$PP-TMP \rightarrow IN NP$

$IN \rightarrow In$

$NP \rightarrow NNP$

$NNP \rightarrow July$

$, \rightarrow ,$

$NP-SBJ \rightarrow DT NNP NNP NNP$

$DT \rightarrow the$

$NNP \rightarrow Environmental$

$NNP \rightarrow Protection$

$NNP \rightarrow Agency$

$VP \rightarrow VBD NP PP-CLR$

$VBD \rightarrow imposed$

$NP \rightarrow DT JJ NN$

$DT \rightarrow a$

$JJ \rightarrow gradual$

$NN \rightarrow ban$

$PP-CLR \rightarrow IN NP$

$IN \rightarrow on$

$NP \rightarrow NP PP$

$NP \rightarrow ADJP NNS$

$ADJP \rightarrow RB DT$

$RB \rightarrow virtually$

$DT \rightarrow all$

$NNS \rightarrow uses$

$PP \rightarrow IN NP$

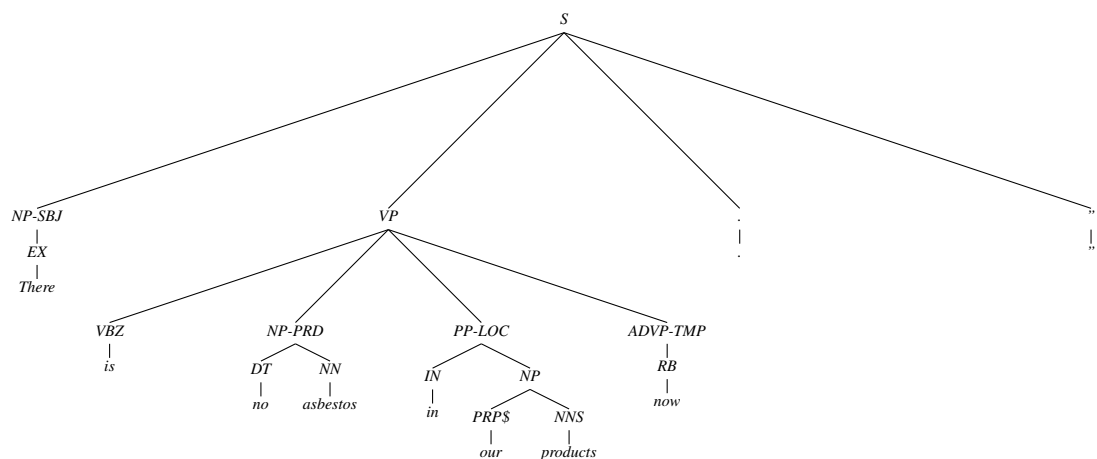
$IN \rightarrow of$

$NP \rightarrow NN$

$NN \rightarrow asbestos$

$. \rightarrow .$

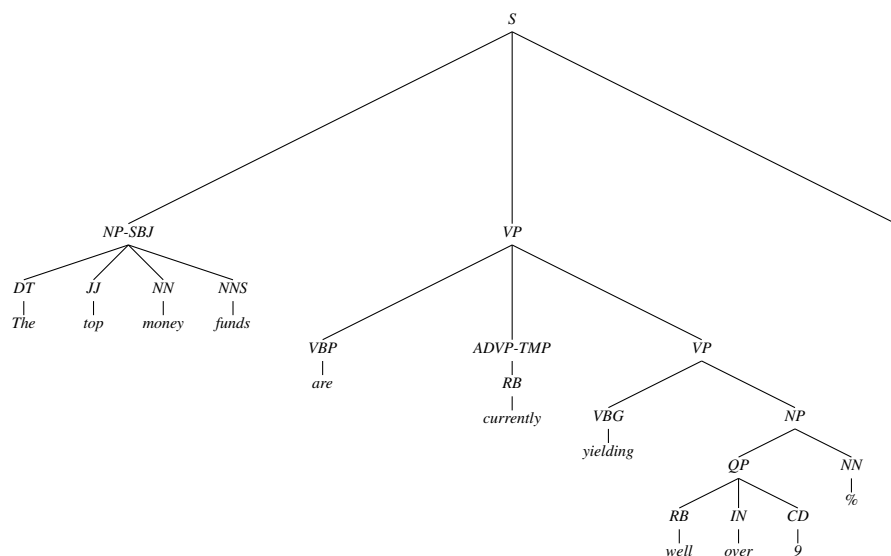
(b) *There is no Asbestos in our products now."*



Rules:

|                                                   |                              |
|---------------------------------------------------|------------------------------|
| $S \rightarrow NP - SBJ VP . "$                   | $PP - LOC \rightarrow IN NP$ |
| $NP - SBJ \rightarrow EX$                         | $IN \rightarrow in$          |
| $EX \rightarrow There$                            | $NP \rightarrow PRP\$ NNS$   |
| $VP \rightarrow VBZ NP - PRD PP - LOC ADVP - TMP$ | $PRP\$ \rightarrow our$      |
| $VBZ \rightarrow is$                              | $NNS \rightarrow products$   |
| $NP - PRD \rightarrow DT NN$                      | $ADVP - TMP \rightarrow RB$  |
| $DT \rightarrow no$                               | $RB \rightarrow now$         |
| $NN \rightarrow asbestos$                         | $. \rightarrow .$            |
|                                                   | $" \rightarrow "$            |

(c) The top money funds are currently yielding well over 9%.



Rules:

|                                     |                            |
|-------------------------------------|----------------------------|
| $S \rightarrow NP - SBJ VP .$       | $RB \rightarrow currently$ |
| $NP - SBJ \rightarrow DT JJ NN NNS$ | $VP \rightarrow VBG NP$    |
| $DT \rightarrow The$                | $VBG \rightarrow yielding$ |
| $JJ \rightarrow top$                | $NP \rightarrow QP NN$     |
| $NN \rightarrow money$              | $QP \rightarrow RB IN CD$  |
| $NNS \rightarrow funds$             | $RB \rightarrow well$      |
| $VP \rightarrow VBP ADVP - TMP VP$  | $IN \rightarrow over$      |
| $VBP \rightarrow are$               | $CD \rightarrow 9$         |
| $ADVP - TMP \rightarrow RB$         | $NN \rightarrow \%$        |
|                                     | $. \rightarrow .$          |

4. Consider the following sentence:

“List me the seats on the flight to Denver.”

- (a) Give as many meanings for this sentence as you can (aim for more than 3). (4 points, 1 for each meaning)

*Solution: there’s basically a couple of permutations on how the two prepositional phrases modify either the head noun (seats) or the main verb (List) of the phrase:*

- i. *The listing happens on the flight to Denver, and the seats are on the flight to Denver.*
- ii. *The listing happens on the flight to Denver, but the seats are not on the flight (they could be theatre seats, for instance)*
- iii. *The listing does not happen on the flight to Denver, but the seats are on the flight to Denver.*
- iv. *The listing does not happen on the flight to Denver, and the seats are not on the flight to Denver (they could again be theatre seats)*

- (b) Replace the grammar in the `grammar_script.py` file with the rules of the miniature grammar of English given in Figure 12.1, plus the rules listed below, as well as any extra lexicon rules necessary to parse the above sentence. Find all possible parses of the above sentence. (4 points, 1 for each parse tree)

*Note: in the rules below, IVP stands for imperative verb phrase, and IVerb stands for imperative verb.*

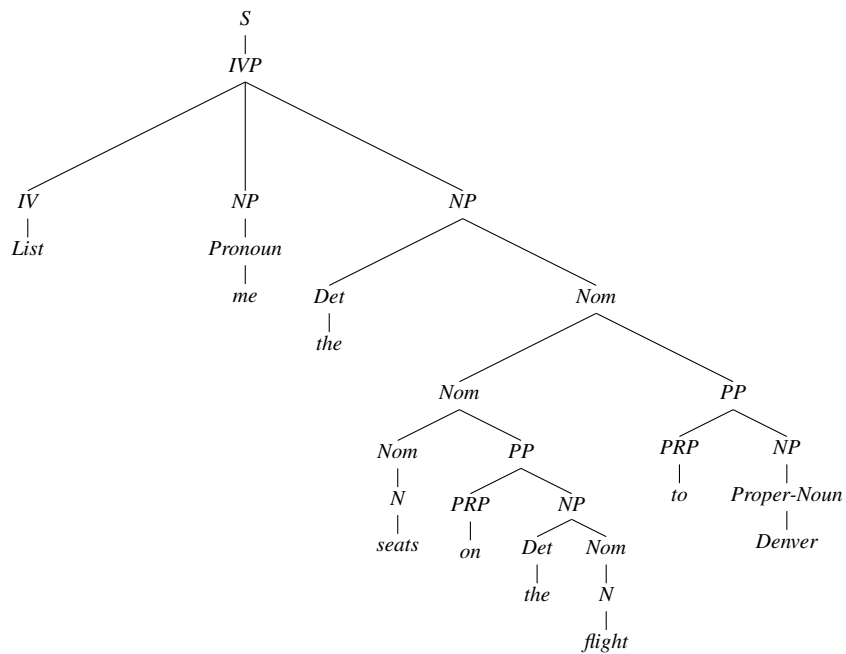
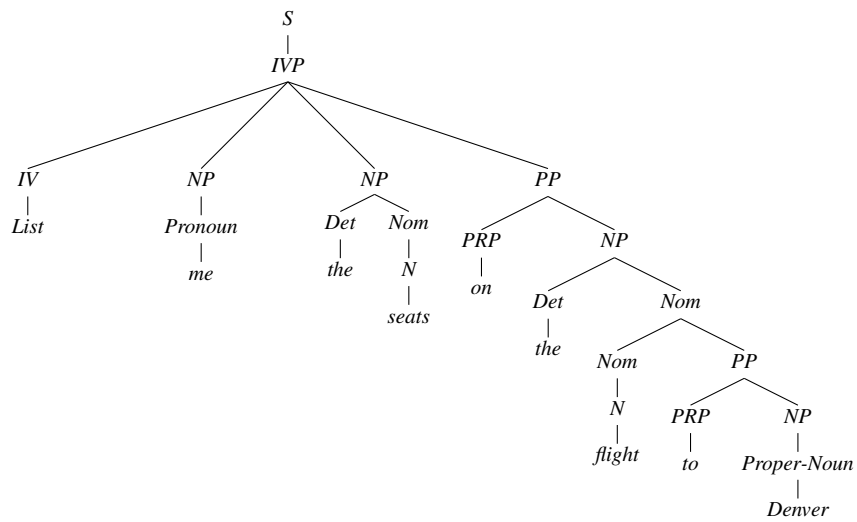
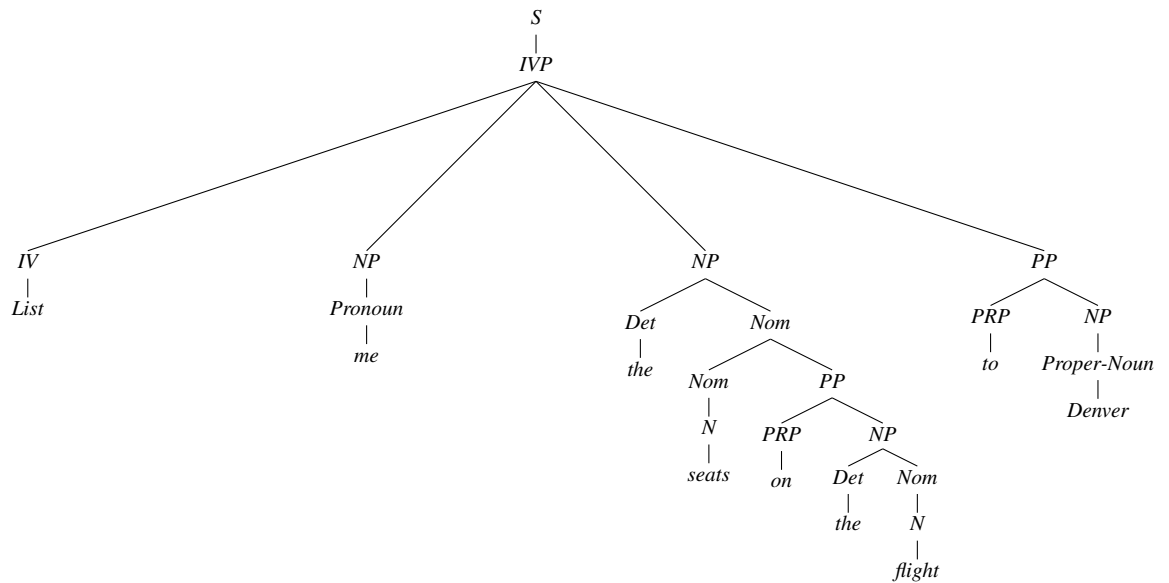
$$\begin{aligned}
 S &\rightarrow IVP \\
 IVP &\rightarrow IVerb NP NP \\
 IVP &\rightarrow IVerb NP NP PP
 \end{aligned}$$

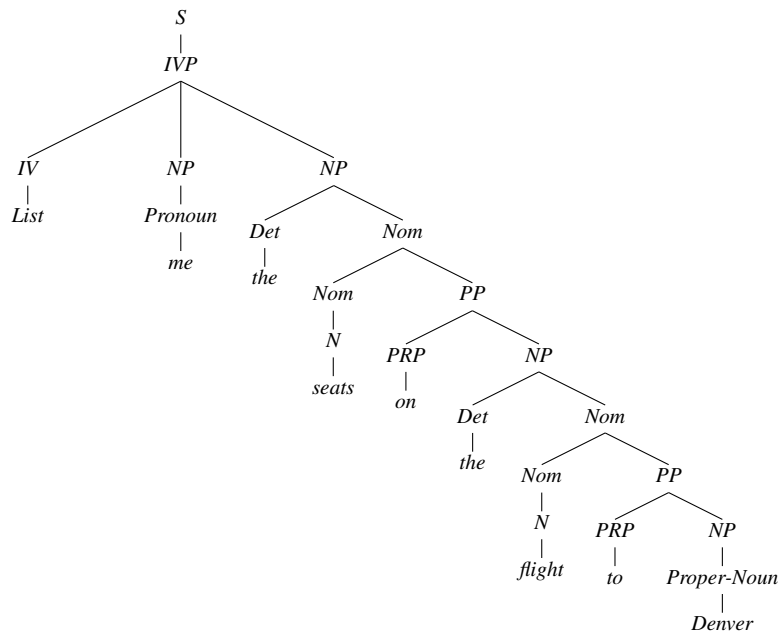
| Grammar                            | Lexicon                                                               |
|------------------------------------|-----------------------------------------------------------------------|
| $S \rightarrow NP VP$              | $Det \rightarrow that \mid this \mid the \mid a$                      |
| $S \rightarrow Aux NP VP$          | $Noun \rightarrow book \mid flight \mid meal \mid money$              |
| $S \rightarrow VP$                 | $Verb \rightarrow book \mid include \mid prefer$                      |
| $NP \rightarrow Pronoun$           | $Pronoun \rightarrow I \mid she \mid me$                              |
| $NP \rightarrow Proper-Noun$       | $Proper-Noun \rightarrow Houston \mid NWA$                            |
| $NP \rightarrow Det Nominal$       | $Aux \rightarrow does$                                                |
| $Nominal \rightarrow Noun$         | $Preposition \rightarrow from \mid to \mid on \mid near \mid through$ |
| $Nominal \rightarrow Nominal Noun$ |                                                                       |
| $Nominal \rightarrow Nominal PP$   |                                                                       |
| $VP \rightarrow Verb$              |                                                                       |
| $VP \rightarrow Verb NP$           |                                                                       |
| $VP \rightarrow Verb NP PP$        |                                                                       |
| $VP \rightarrow Verb PP$           |                                                                       |
| $VP \rightarrow VP PP$             |                                                                       |
| $PP \rightarrow Preposition NP$    |                                                                       |

**Figure 12.1** The  $\mathcal{L}_1$  miniature English grammar and lexicon.



Solution: please see `grammar_sol.py`. You should get 4 parses:



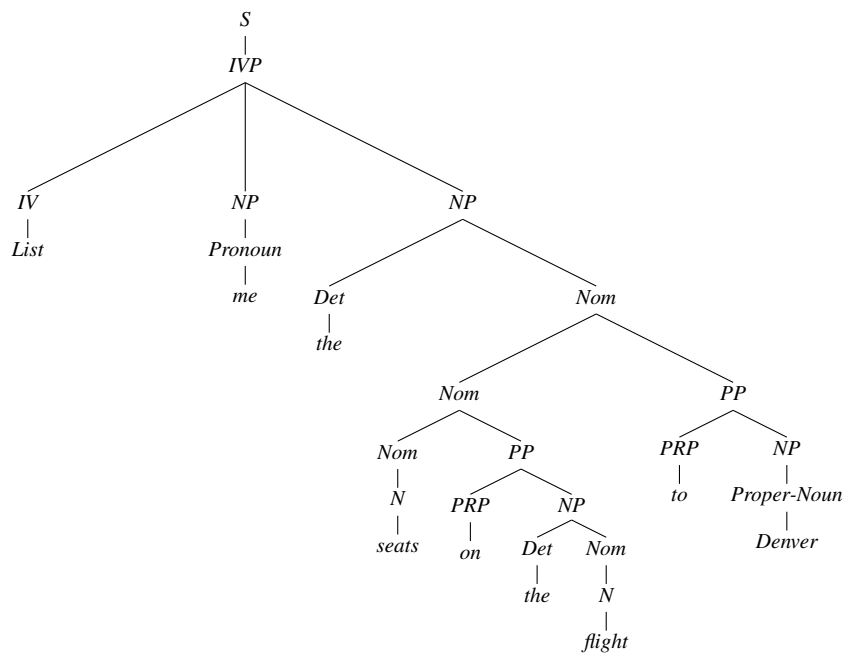


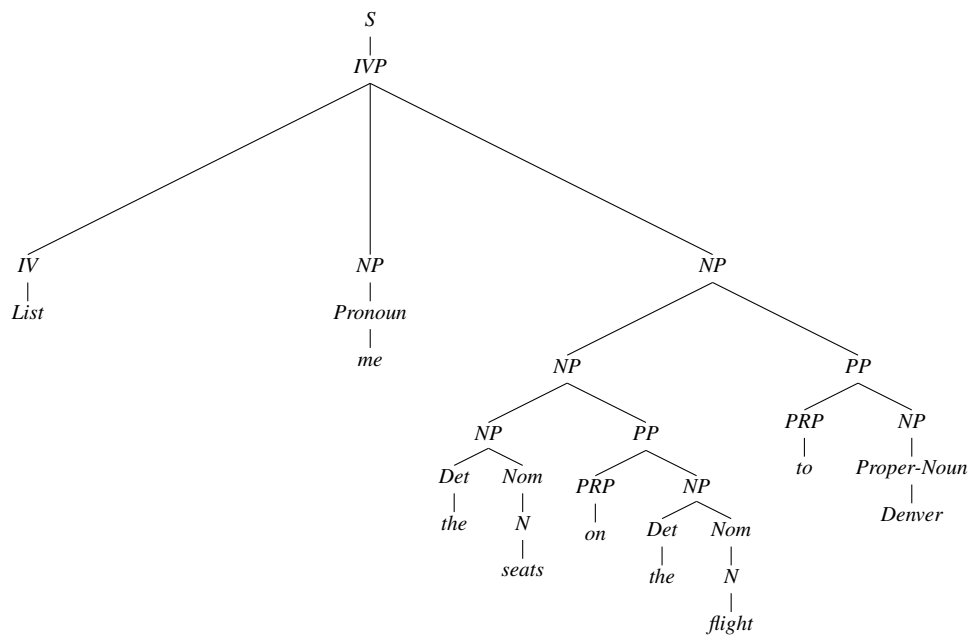
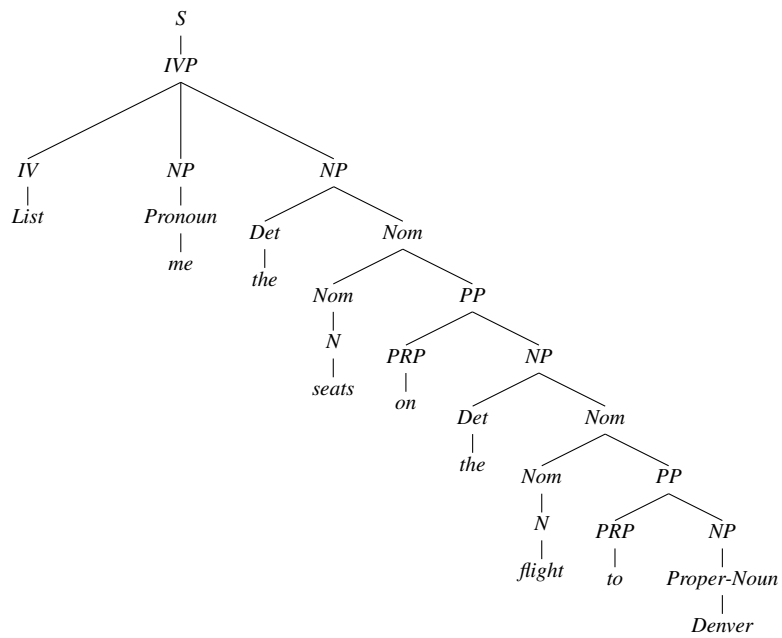
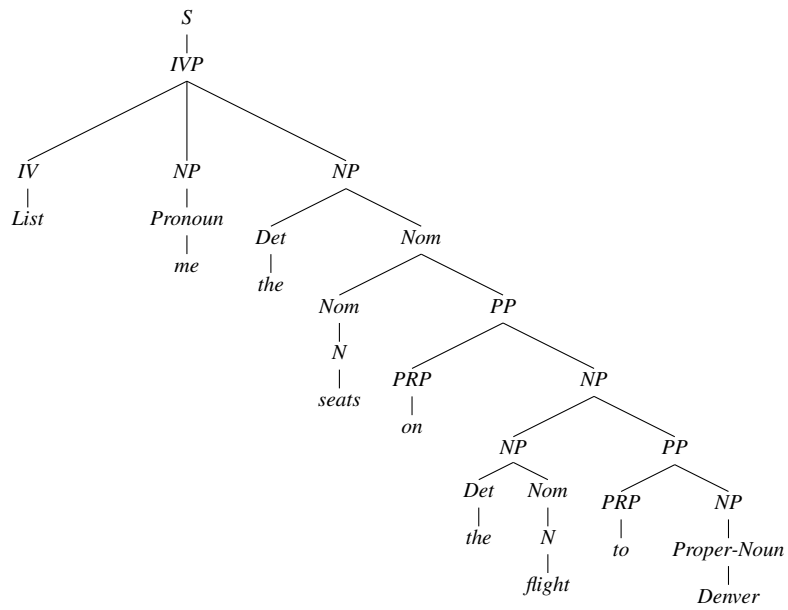
- (c) Repeat the above procedure, but this time with the following rule added to your previous stack of rules:

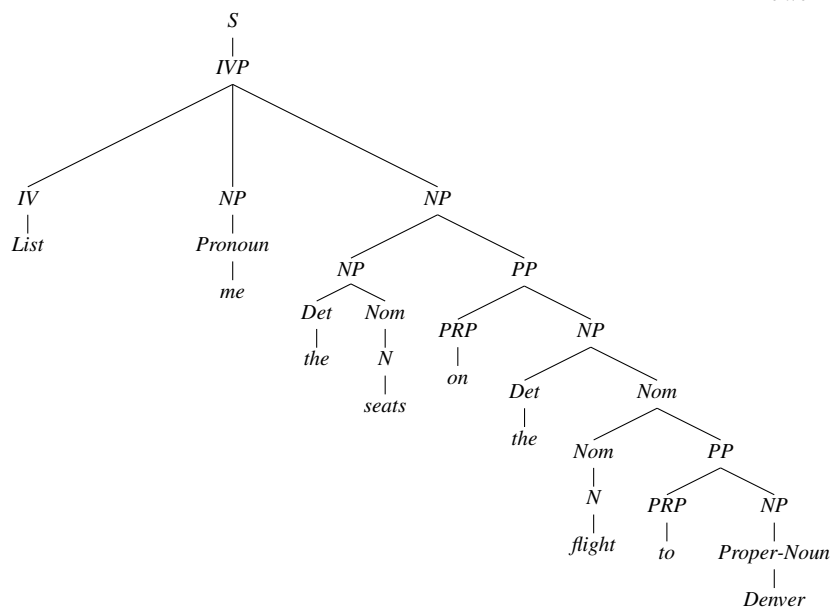
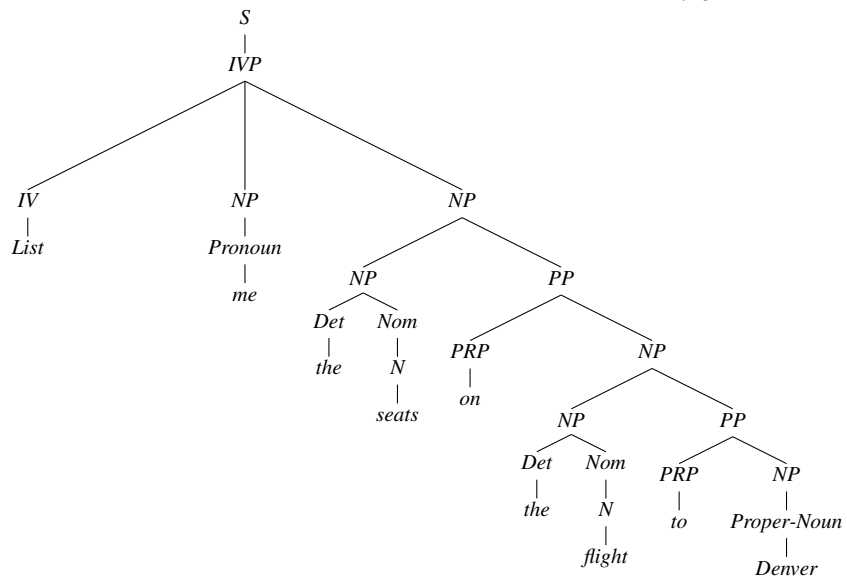
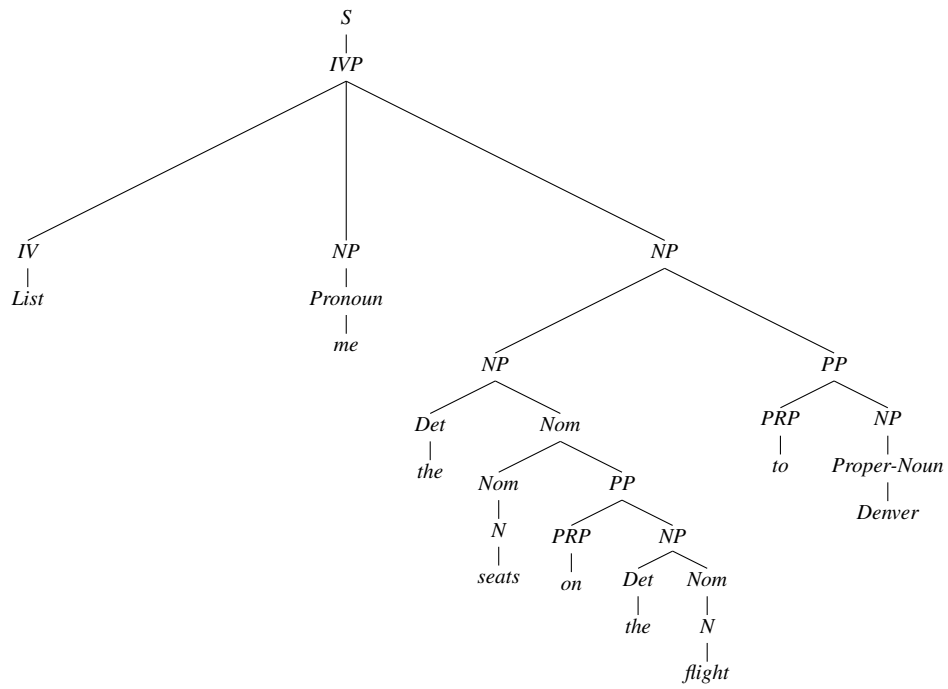
$$NP \rightarrow NP PP$$

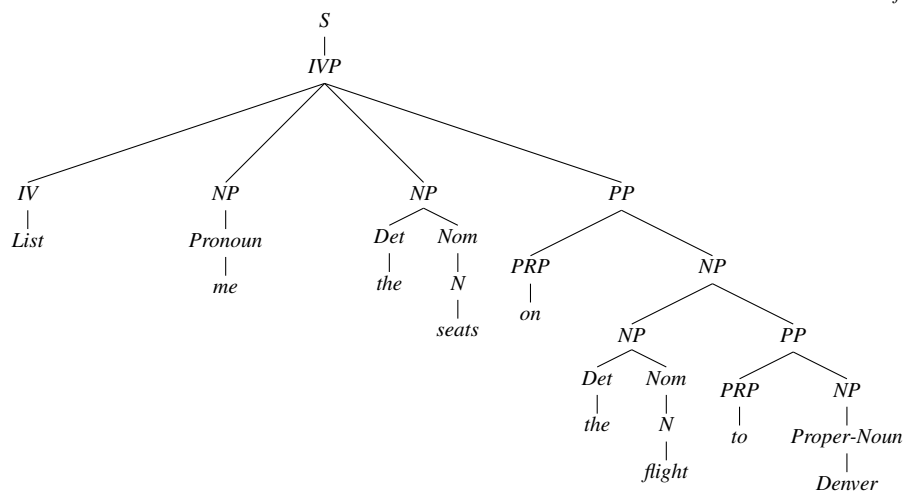
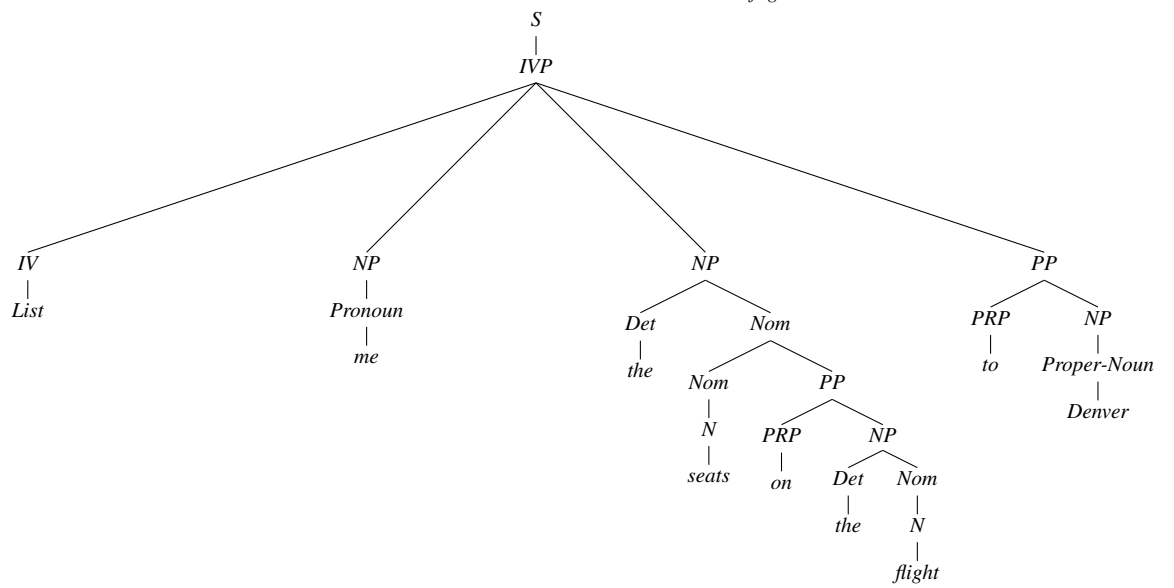
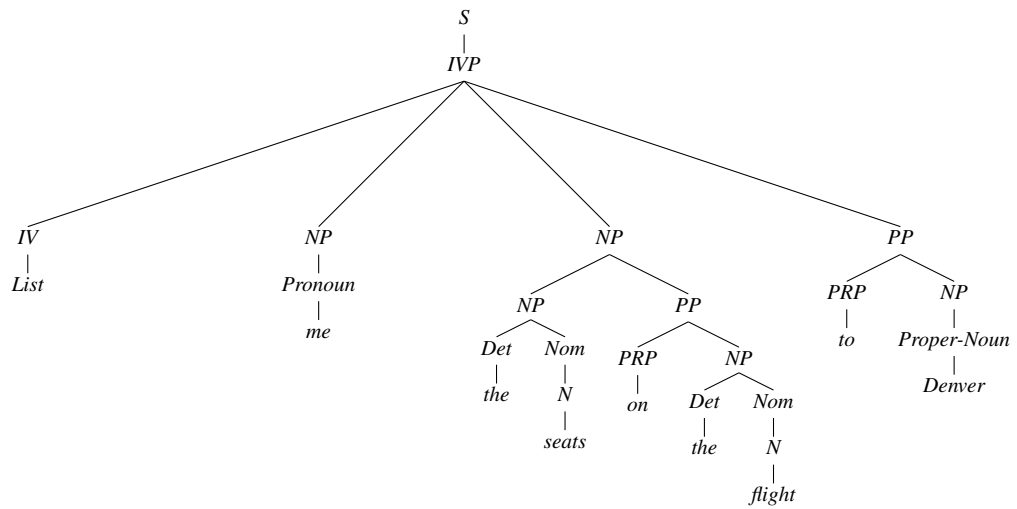
How many new parses do you get this time? (2 points)

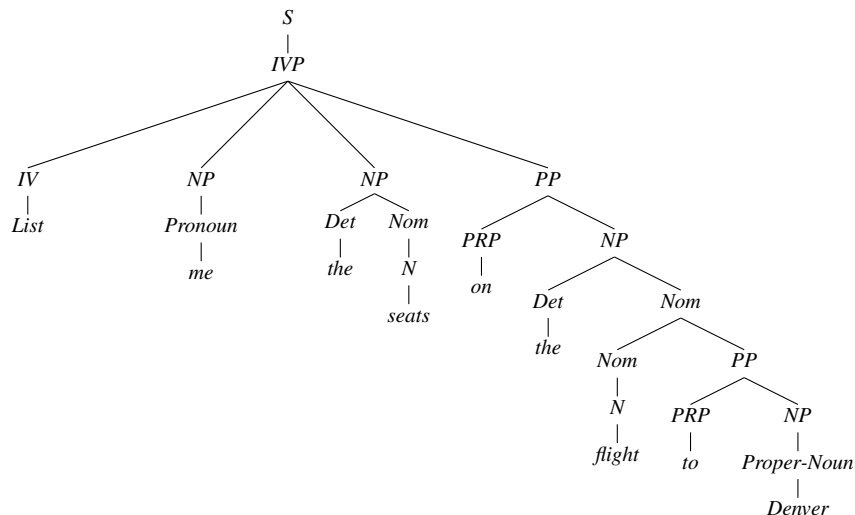
*Solution: please see grammar\_sol.py. You should get 11 parses this time:*











- (d) Did you discover any new meanings from the parses of parts (b) and (c) above? Describe and discuss these new meanings. List any parses that are nonsensical. (4 points)

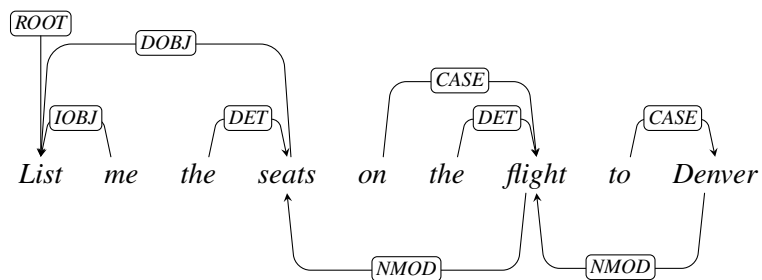
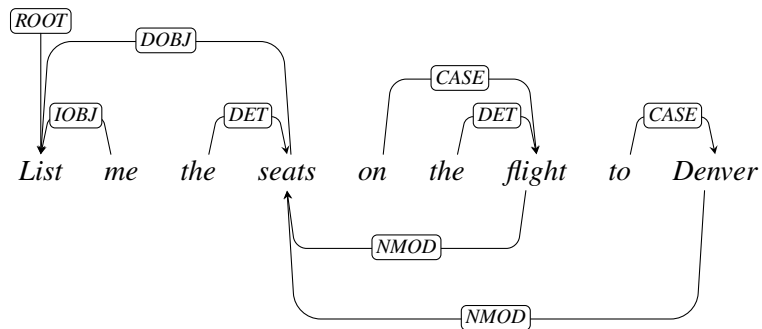
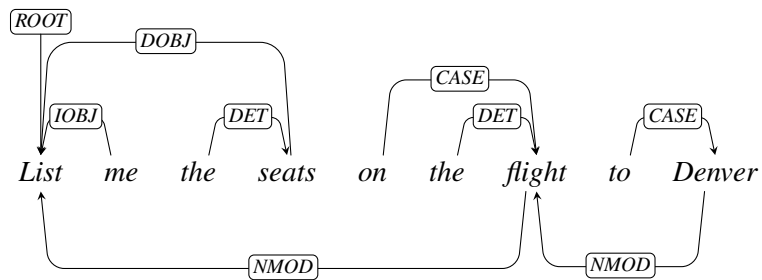
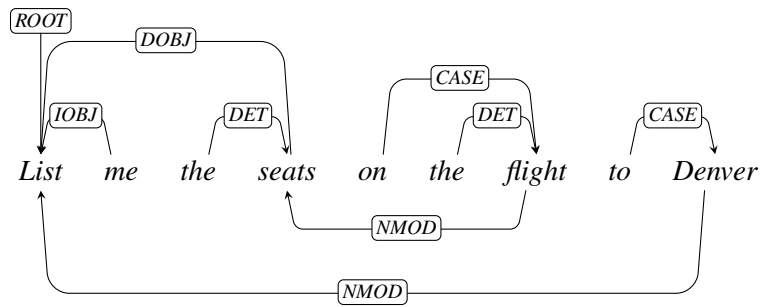
*Solution: the new meanings would be cases where “to Denver” modifies the main verb, which would mean the listing happens to Denver, which is nonsensical (but would make sense for a different PP like “whilst driving”).*

- (e) Use the following dependency labels table and without using any NLTK routines, so by hand, transform the CFG parse trees provided by NLTK for part (b) above (so before adding the rule in part (c)) to dependency trees. (4 points per tree, 16 points in total)

| Clausal Argument Relations | Description                                        |
|----------------------------|----------------------------------------------------|
| NSUBJ                      | Nominal subject                                    |
| DOBJ                       | Direct object                                      |
| IOBJ                       | Indirect object                                    |
| CCOMP                      | Clausal complement                                 |
| XCOMP                      | Open clausal complement                            |
| Nominal Modifier Relations | Description                                        |
| NMOD                       | Nominal modifier                                   |
| AMOD                       | Adjectival modifier                                |
| NUMMOD                     | Numeric modifier                                   |
| APPOS                      | Appositional modifier                              |
| DET                        | Determiner                                         |
| CASE                       | Prepositions, postpositions and other case markers |
| Other Notable Relations    | Description                                        |
| CONJ                       | Conjunct                                           |
| CC                         | Coordinating conjunction                           |

**Figure 14.2** Selected dependency relations from the Universal Dependency set. (de Marneffe et al., 2014)

*Solution: we get basically the same tree four times, but the modification arrows differ per tree:*



Total: 30 points

5. Using the syntactic categories and the lexicon exemplified in Ch. 11, draw a CCG parse tree for 2.(f). Clearly label your tree with the CCG rules that you are using. (5 points, 2 for using the coordination rule correctly, 1 for each of the other rules, total of 5 points)

Total: 5 points

*Solution:*

$$\begin{array}{c}
 \frac{We}{NP} \quad \frac{flew}{(S \backslash NP)/PP} \quad \frac{to}{PP/NP} \quad \frac{Baltimore}{NP} \quad \frac{Denver}{NP} \\
 \frac{\frac{\frac{\frac{\frac{\frac{NP}{NP} \text{ CONJ } NP}{PP} >}{S \backslash NP} <}{S} <
 \end{array}$$

6. Load the parsed version of ATIS corpus into NLTK and extract the CFG grammar used to parse it. The parsed version of ATIS can be found in the `parseTrees.txt`, and some starting code is available in `grammar_prob.py`. You can use an NLTK routine [here](#). (5 points)

Learn the probabilities of your grammar from the parsed corpus and turn your grammar into a PCFG. This part needs programming, but do not use the `induce_pcfg` NLTK routine. (40 points)

Now, given your PCFG, compute what is the most likely parse of the ambiguous sentence “Show me the meals on the flight from Phoenix”. (8 points)

Provide the following two items with your answer to this question (5 points):

- (a) your PCFG,
- (b) the probabilities of each of the parse trees of the sentence.

Total: 58 points.

*Solution: this is a programming question, please see `grammar_prob_solution.py`.*