

problem 1

a) words = "they are baking potatoes"

tags1 = PRP, V, Adj, N

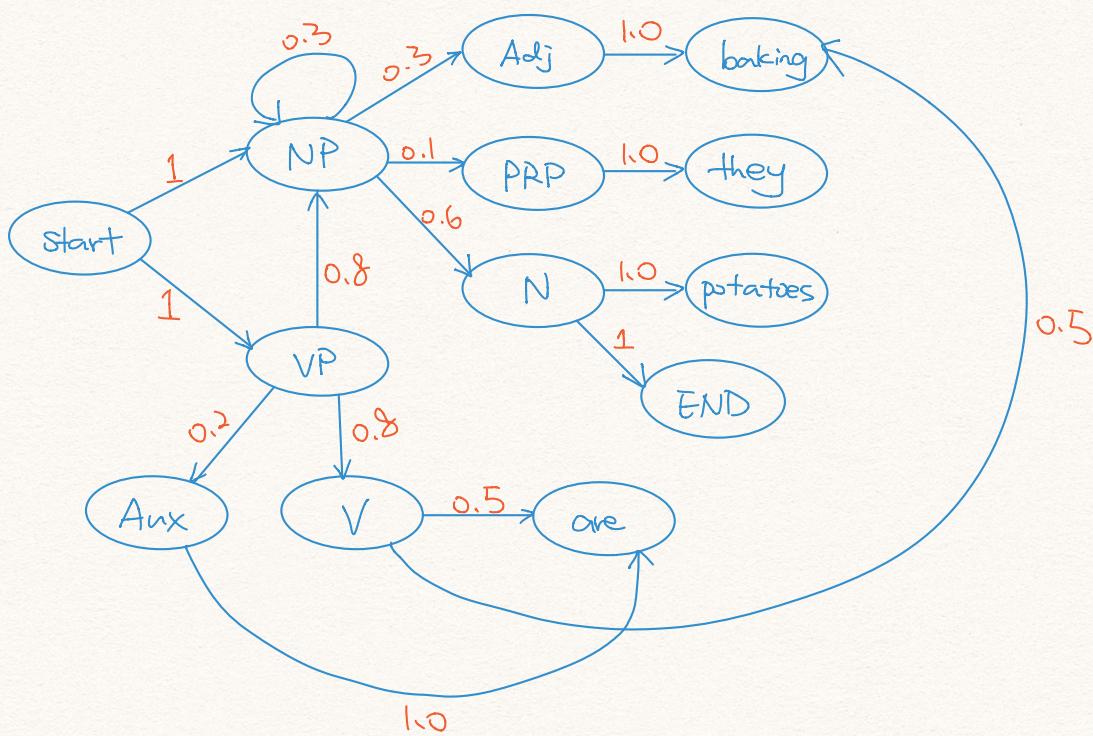
tags2 = PRP, Aux, V, N

According to Q2.b:

$$P(\text{tags1}, \text{words}) = 0.0072$$

$$P(\text{tags2}, \text{words}) = 0.006$$

b)



c) No. PCFGs can express all probabilistic automata, meaning it can represent all CFGs, while HMMs can only represent finite state automata, so that it can only represent regular grammars. And because regular grammar is just a subset of CFGs, therefore not all PCFGs can be translated to HMMs.

problem 2 :

(a)

chart[0]

S → .N VP [0,0] — predict  
N → .potato [0,0] — nothing  
VP → .V NP [0,0] — predict  
VP → .Aux V NP [0,0] — predict  
V → . baking [0,0] — nothing  
V → . are [0,0] — nothing  
NP → .Adj NP [0,0] — predict  
NP → .PRP [0,0] — predict  
NP → .N [0,0] — predict  
Aux → .are [0,0] — nothing  
Adj → . baking [0,0] — nothing  
PRP → .they [0,0] — scan

chart[2]

V → are. [1,2] — complete  
Aux → are. [1,2] — complete  
VP → V. NP [1,2] — predict  
VP → Aux. V NP [1,2] — predict  
NP → .Adj. NP [2,2] — predict  
NP → .PRP [2,2] — predict  
NP → .N [2,2] — predict  
Adj → .baking [2,2] — scan  
PRP → .they [2,2] — nothing  
N → .potatoes [2,2] — nothing

chart[1]

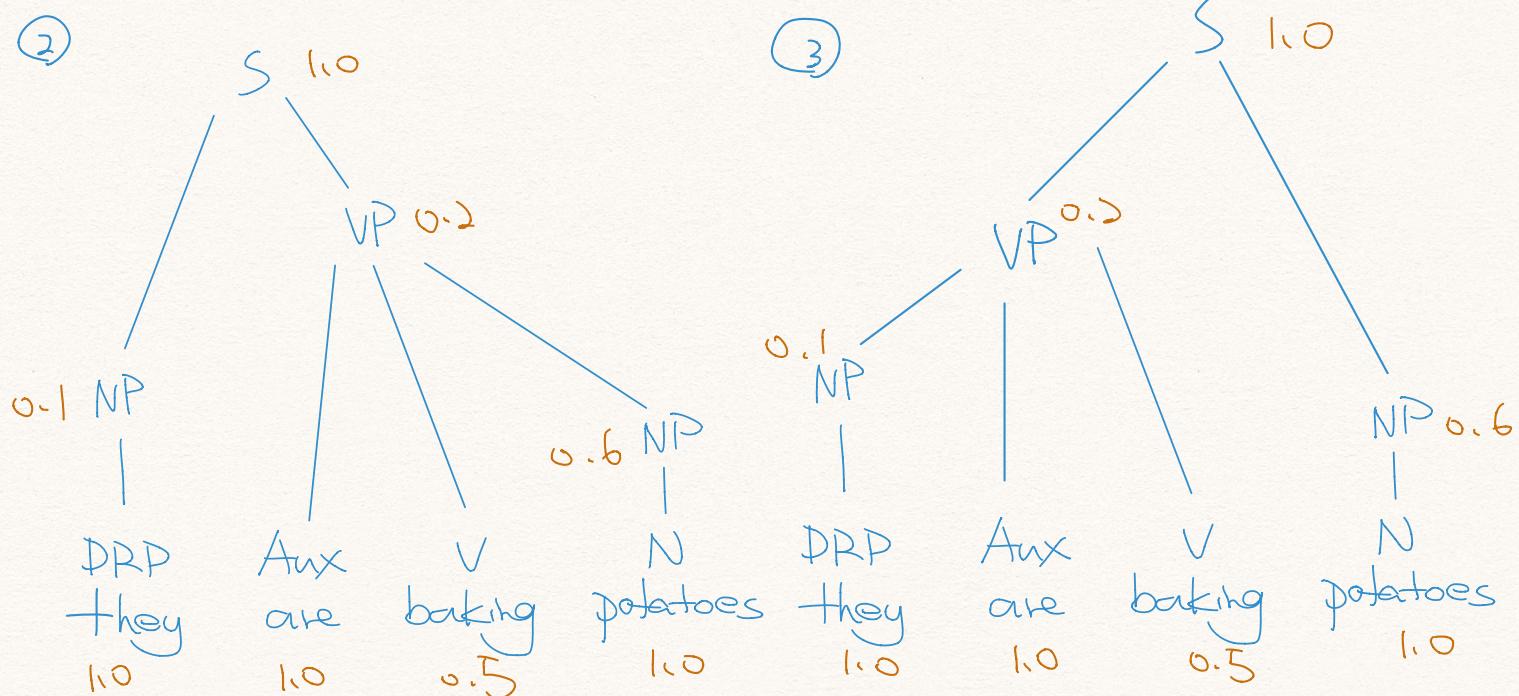
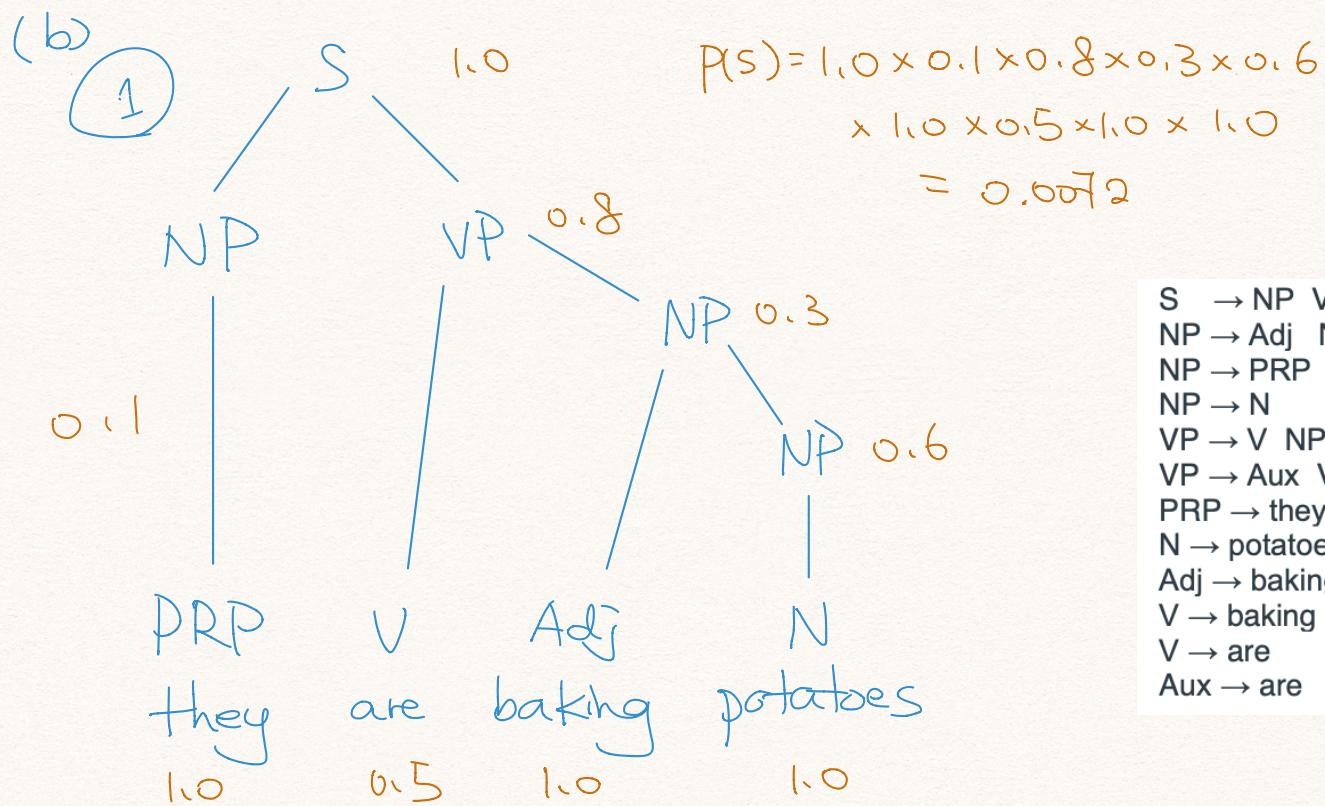
PRP → they. [0,1] — complete  
NP → PRP. [0,1] — complete  
VP → .V NP [0,1] — predict  
VP → .Aux VNP [0,1] — predict  
NP → .Adj NP [0,1] — predict  
V → . baking [1,1] — nothing  
V → . are [1,1] — scan  
Aux → .are [1,1] — scan  
Adj → .baking [1,1] — nothing

chart[3]

Adj → baking. [2,3] — complete  
NP → Adj. NP [2,3] — predict  
Adj → .baking [3,3] — nothing  
NP → .PRP [3,3] — predict  
NP → .N [3,3] — predict  
PRP → .they [3,3] — nothing  
N → .potatoes [3,3] — scan

chart[4]

N → potatoes. [0,4] — complete  
NP → N. [3,4] — complete  
NP → Adj NP. [2,4] — complete  
VP → V NP. [1,4] — complete  
VP → Aux V NP. [1,4] — complete  
S → N VP. [0,4]



$$\begin{aligned}
 P(S) &= 1.0 \times 0.1 \times 0.2 \times 0.6 \\
 &\quad \times 1.0 \times 1.0 \times 0.5 \times 1.0 \\
 &= 0.006
 \end{aligned}$$

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 \end{aligned}$$

### Problem 3

(a)  $S \rightarrow NP VP \quad \checkmark$   
 $NP \rightarrow Adj\ NP \quad \checkmark$   
 $NP \rightarrow PRP \quad \} \Rightarrow NP \rightarrow they$   
 $PRP \rightarrow they \quad \}$   
 $NP \rightarrow N \quad \} \Rightarrow NP \rightarrow potatoes$   
 $N \rightarrow potatoes \quad \}$

$VP \rightarrow Aux V NP : \Rightarrow \left\{ \begin{array}{l} X \rightarrow Aux V \\ VP \rightarrow X NP \end{array} \right.$

$Adj \rightarrow baking \quad \checkmark$   
 $V \rightarrow baking \quad \checkmark$   
 $V \rightarrow are \quad \checkmark$   
 $Aux \rightarrow are \quad \checkmark$

general rule:

①  $\left. \begin{array}{l} A \rightarrow B \\ B \rightarrow b \end{array} \right\} \text{merge to 1: } A \rightarrow b$

②  $A \rightarrow BCD : \left\{ \begin{array}{l} \text{create new rule: } X \rightarrow BC \\ \text{use new rule: } A \rightarrow XD \end{array} \right.$

<u>S → NP VP</u>	✓	[1.0]
NP → Adj NP	✓	[0.3]
NP → PRP	✓	[0.1]
<u>NP → N</u>	✓	[0.6]
VP → V NP	✓	[0.8]
VP → Aux V NP	✓	[0.2]
PRP → they	✓	[1.0]
<u>N → potatoes</u>	✓	[1.0]
Adj → baking		[1.0]
V → baking		[0.5]
V → are		[0.5]
Aux → are		[1.0]

**(b)**

0                    1                    2                    3                    4

		<b>They</b>	<b>are</b>	<b>baking</b>	<b>patatoes</b>
0	/	NP	/	/	S
1	/	/	Aux, V	X	VP
2	/	/	/	Adj, V	NP
3	/	/	/	/	NP
4	/	/	/	/	/

## problem 4

A:

6: [root]

B: [he, sent, her, a, funny, meme, today]

↓ shift

A:

6: [he  
root]

B: [sent, her, a, funny, meme, today]

↓ leftarc nsubj

A: he ←  
nsubj sent

6: [root]

B: [sent, her, a, funny, meme, today]

↓ shift

A: he ←  
nsubj sent

6: [sent  
root]

B: [her, a, funny, meme, today]

↓ Rightarc obj:

A: he ←  
nsubj sent →  
obj her

6: [root]

B: [sent, a, funny, meme, today]

↓ shift

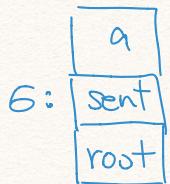
A: he ←  
nsubj sent →  
obj her

6: [sent  
root]

B: [a, funny, meme, today]

A: he  $\xleftarrow{\text{nssubj}}$  sent  $\xrightarrow{\text{obj}}$  her

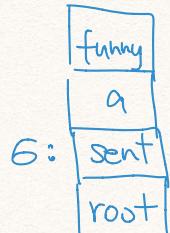
↓ shift



B: [funny, meme, today]

A: he  $\xleftarrow{\text{nssubj}}$  sent  $\xrightarrow{\text{obj}}$  her

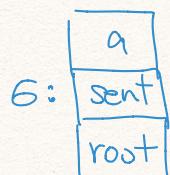
↓ shift



B: [meme, today]

A: he  $\xleftarrow{\text{nssubj}}$  sent  $\xrightarrow{\text{obj}}$  her      funny  $\xleftarrow{\text{amod}}$  meme

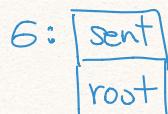
↓ leftarc amod



B: [meme, today]

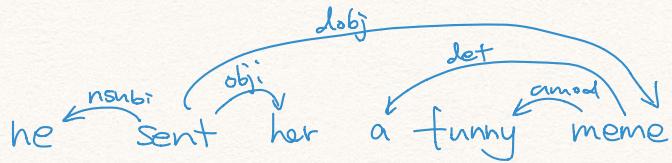
A: he  $\xleftarrow{\text{nssubj}}$  sent  $\xrightarrow{\text{obj}}$  her      a  $\xleftarrow{\text{det}}$  funny  $\xleftarrow{\text{amod}}$  meme

↓ leftarc det



B: [meme, today]

A:



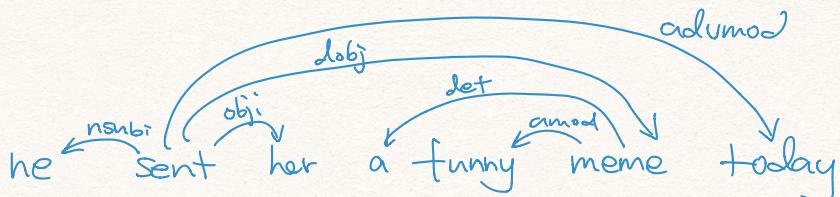
↓ Rightarc dobj

G:

[root]

B: [Sent, today]

A:



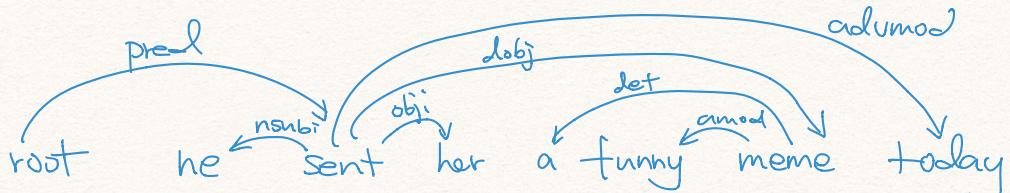
↓ Rightarc advmmod

G:

[root]

B: [Sent ]

A:



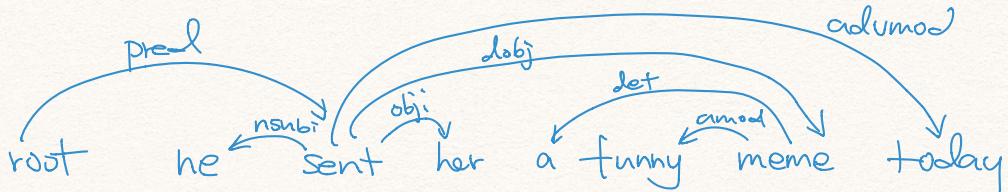
↓ Rightarc pred

G:

B: [root ]

↓ shift

A:



G:

[root ]

B: [ ]

## Programming Component:

### part1

```
1 def verify_grammar(self):
2     """
3         Return True if the grammar is a valid PCFG in CNF.
4         Otherwise return False.
5     """
6     # TODO, Part 1
7     for lhs, rule in self.lhs_to_rules.items():
8         #lhs should always be upper
9         if not lhs.isupper():
10             return False
11         prob_lst = []
12         for curr in rule:
13             #total length should be 3 (lhs, rhs, prob)
14             #grammar in tuple
15             #prob should be float
16             #length 2 on rhs + all upper
17             #length 1 on rhs + lower
18             if (len(curr) != 3) \
19                 or not(isinstance(curr[1], tuple)) \
20                 or not (isinstance(curr[2], (int, float))) \
21                 or not ((len(curr[1]) == 2 and curr[1][0].isupper() and curr[1]
22 [1].isupper())) \
23                 or not (len(curr[1]) == 1 and not curr[1][0].isupper()):
24                 return False
25             else:
26                 prob_lst.append(curr[2])
27
28             #prob sum to 1
29             if not isclose(fsum(prob_lst), 1.):
30                 return False
31
32     return True
```

## part2

```
1 def is_in_language(self, tokens):
2     """
3         Membership checking. Parse the input tokens and return True if
4         the sentence is in the language described by the grammar. Otherwise
5         return False
6     """
7     # TODO, part 2
8     n = len(tokens)
9     pi = defaultdict(list)
10    #initialization
11    for i in range(n):
12        for curr in self.grammar.rhs_to_rules[(tokens[i],)]:
13            if len(curr[1]) == 1:
14                pi[(i, i+1)].append(curr[0])
15    #main loop
16    for length in range(2, n + 1):
17        for i in range(n-length+1):
18            j = i + length
19            for k in range(i+1, j):
20                for B in pi[(i, k)]:
21                    for C in pi[(k, j)]:
22                        rules = self.grammar.rhs_to_rules[(B, C)]
23                        for curr in rules:
24                            pi[(i, j)].append(curr[0])
25
26    return self.grammar.startsymbol in pi[(0, n)]
```

## part3

```
1 def parse_with_backpointers(self, tokens):
2     """
3         Parse the input tokens and return a parse table and a probability table.
4     """
5     # TODO, part 3
6     n = len(tokens)
7     table = defaultdict(dict)
8     probs = defaultdict(dict)
9     #initialization
10    for i in range(n):
11        for curr in self.grammar.rhs_to_rules[(tokens[i],)]:
12            if len(curr[1]) == 1:
13                span = (i, i+1)
14                table[span][curr[0]] = tokens[i]
15                probs[span][curr[0]] = math.log(curr[2])
16    #main loop
17    for length in range(2, n + 1):
18        for i in range(n-length+1):
19            j = i + length
20            for k in range(i+1, j):
21                for B in table[(i, k)]:
22                    for C in table[(k, j)]:
23                        rules = self.grammar.rhs_to_rules[(B, C)]
24                        if rules:
25                            B_prob = probs[(i, k)][B]
26                            C_prob = probs[(k, j)][C]
27                            for curr in rules:
28                                curr_prob = math.fsum([math.log(curr[2]), B_prob,
29                                         C_prob])
30                                span = (i, j)
31                                if curr[0] not in probs[span] or curr_prob >
32                                    probs[span][curr[0]]:
33                                        table[span][curr[0]] = ((B,i,k),(C,k,j))
34                                        probs[span][curr[0]] = curr_prob
35
36    return table, probs
```

## part4

```
1 def get_tree(chart, i, j, nt):
2     """
3         Return the parse-tree rooted in non-terminal nt and covering span i,j.
4     """
5     # TODO: Part 4
6     # if i >= j or nt not in chart[(i, j)]:
7     #     return tuple([])
8     if j == i + 1:
9         return (nt, chart[(i, j)][nt])
10
11    left_nt, left_i, left_j = chart[(i, j)][nt][0]
12    right_nt, right_i, right_j = chart[(i, j)][nt][1]
13    return (nt, get_tree(chart, left_i, left_j, left_nt), get_tree(chart, right_i,
right_j, right_nt))
```