

Question 1

[Points 15] A grammar is ambiguous if it can generate a string two or more ways. In other words, a string generated by the grammar does not have a unique parse tree.

Given grammar:

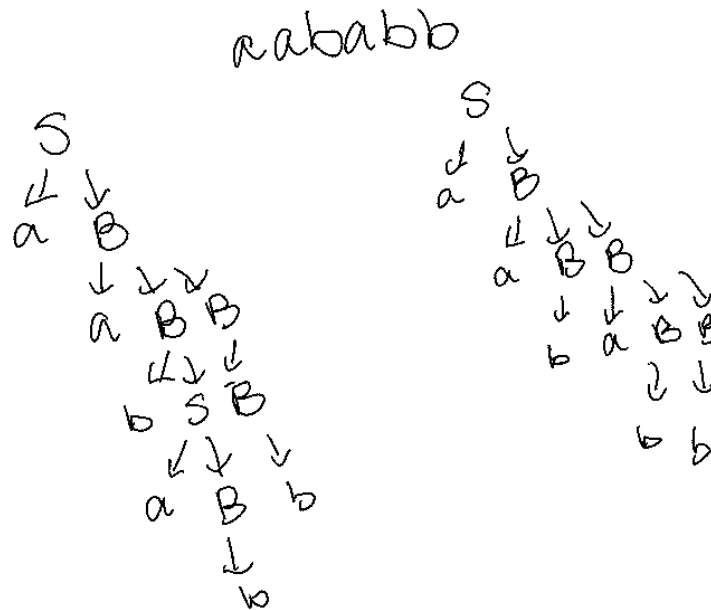
$S \rightarrow aB \mid bA$

$A \rightarrow a \mid aS \mid bAA$

$B \rightarrow b \mid bS \mid aBB$

Is the above grammar ambiguous? Provide an example and show parse tree to validate your answer.

Answer: The grammar is ambiguous because there exists two distinct parse trees for the string `aababbb`. The two parse trees are shown below:



Question 2

[Points 15] Describe issue of BLEU Score. Given candidate translation sentences and their references below, compute modified BLEU score.

Candidate 1: It is a guide to action which ensures that the military always obeys the commands of the party.

Candidate 2: It is to ensure the troops forever hearing the activity guidebook that party direct.

Reference 1: It is a guide to action that ensures that the military will forever heed Party commands.

Reference 2: It is the guiding principle which guarantees the military forces always being under the command of the Party.

Reference 3: It is the practical guide for the army always to heed the directions of the party.

Evaluate your translation model performance using BLEU score where n -gram order, $N = 2$. Please show the best reference during your computation.

Answer: The BLEU score is computed using the modified formula, where the geometric mean of each n -gram precision is computed.

Candidate	Unigram	Bigram	Modified BLEU
1	0.95	0.61	0.76
2	0.53	0.06	0.18

The best reference for the modified BLEU score is reference 1, as shown in the table below.

Reference	Candidate	Unigram	Bigram	Modified BLEU
1	1	0.63	0.44	0.53
	2	0.41	0.06	0.16
2	1	0.53	0.17	0.30
	2	0.26	0.05	0.12
3	1	0.58	0.22	0.36
	2	0.41	0.06	0.16

Question 3

[Points 10] Given a grammar below

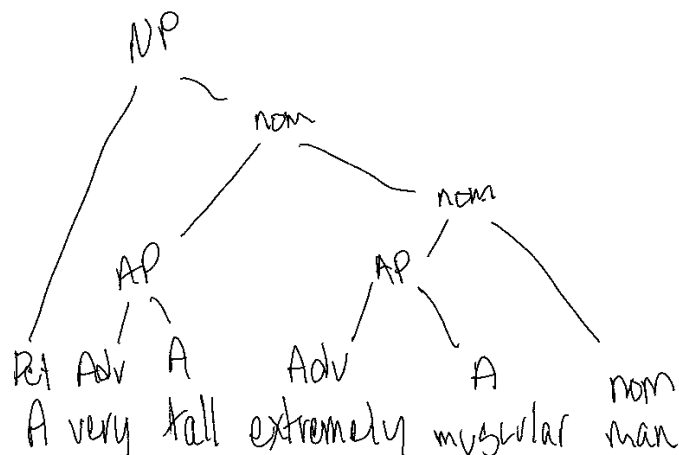
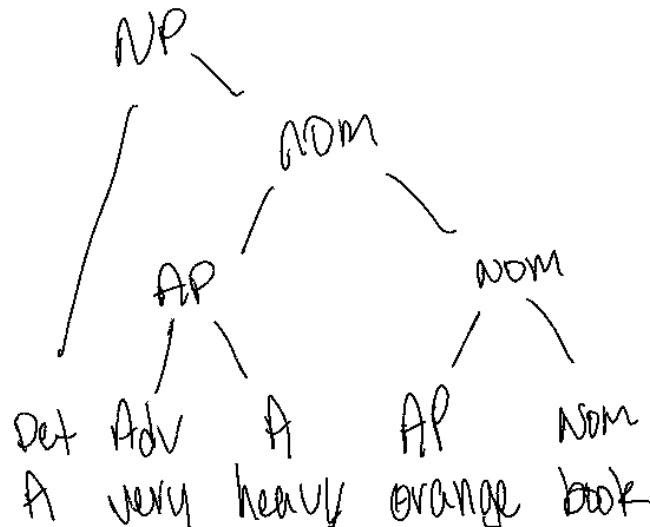
NP	→	Det Nom
Nom	→	AP Nom
AP	→	Adv A
Det	→	a an
Adv	→	very extremely
AP	→	heavy orange tall
A	→	heavy orange tall muscular
Nom	→	book orange man

Show a parse tree for the following sentences:

Sentence 1: A very heavy orange book

Sentence 2: A very tall extremely muscular man

Answer:



Question 4

[Points 5] Write down the differences between attachment ambiguity and coordination ambiguity.

Answer: Attachment ambiguity occurs when it is uncertain where a phrase or clause should be attached to a sentence. In the example: "I saw the man with the telescope.", the prepositional phrase can be attached as a noun phrase or a verb phrase. In other words, it's unclear whether "I saw the man holding the telescope." or "I saw the man through the telescope."

Coordination ambiguity occurs when different phrases can be coinjoined with conjunctions such as "and" or "or". For example, in a sentence that can modify both sides of the conjunction as in "secure hardware and software", it is ambiguous if both the hardware and software are secure, or if only the hardware is secure.

Question 5

[Points 15] Suppose you build two summarizer systems, and your systems generates the following summary. You named your summarizer as S1 and S2, respectively. You are also given reference summary below.

S1 Summary: neymar scored his side's second goal with a curling free kick, and 15 minutes to play in the 2-2 draw at sevilla on saturday night, according to reports in spain.

S2 Summary: barcelona's neymar substituted in 2-2 draw at sevilla on saturday night, spain's kamui kobayashi claims a late free kick in the champions league after his second goal with the score

Reference summary: neymar was taken off with barcelona 2-1 up against sevilla. the brazil captain was visibly angry, and barca went on to draw 2-2. neymar has been replaced 15 times in 34 games this season. [click here](#) for all the latest barcelona news.

Please compute the performance of your system using ROUGE-1 and ROUGE-2 - precision, recall, and f1 score metrics and compare both systems with respective ROUGE metrics (e.g., ROUGE-1 S1 vs. ROUGE-1 S2). Based on your comparison, which one of the ROUGE metrics would you select to evaluate your system performance?

Answer: I would choose the F1 metric, since it contains information from both precision and recall. My scores are calculated after removing punctuation and tokenizing each summary.

System	Precision	Recall	F1
ROUGE-1 S1	0.34	0.25	0.29
ROUGE-1 S2	0.27	0.20	0.23
ROUGE-2 S1	0.03	0.02	0.03
ROUGE-2 S2	0.03	0.02	0.03

Question 6

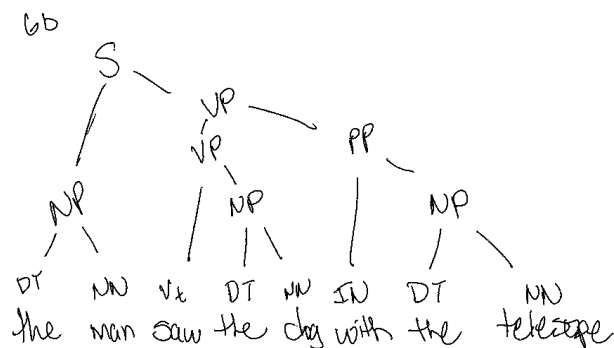
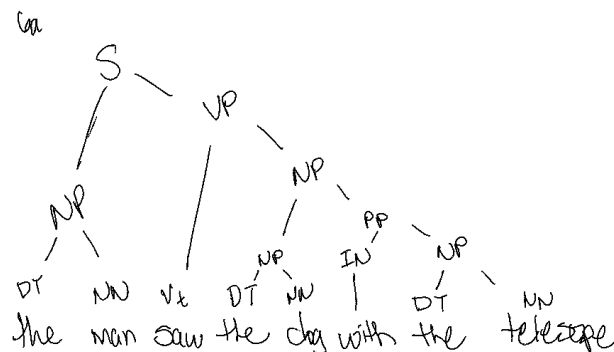
[Points 5] Given a grammar below

S	→	NP VP
VP	→	Vi
VP	→	Vt NP
VP	→	VP PP
NP	→	DT NN
NP	→	NP PP
PP	→	IN NP
Vi	→	'sleeps'
Vt	→	'saw'
NN	→	'man'
NN	→	'woman'
NN	→	'telescope'
NN	→	'dog'
DT	→	'the'
IN	→	'with'
IN	→	'in'

Show that this grammar is ambiguous and produces two different parse tree for the following sentence.

Sentence: the man saw the dog with the telescope

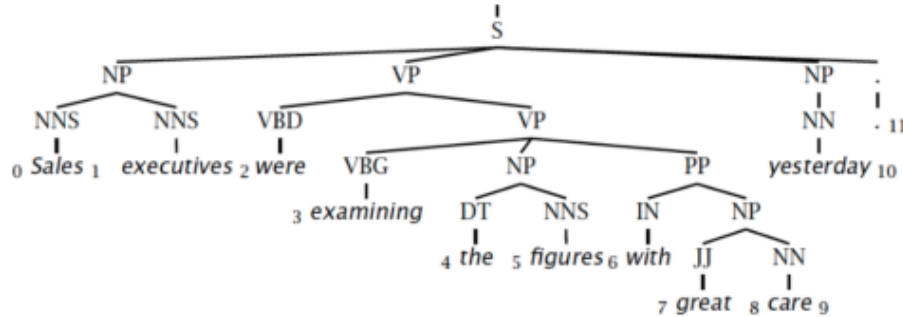
Answer:



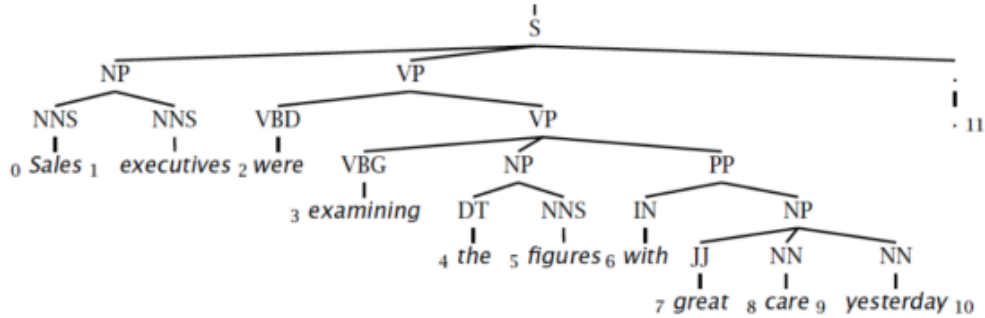
Question 7

[Points 20] Evaluate the following example and compute precision, recall and F1 scores.

Gold standard brackets: S-(0:11), NP-(0:2), VP-(2:9), VP-(3:9), NP-(4:6), PP-(6:9), NP-(7,9), NP-(9:10)



Candidate brackets: S-(0:11), NP-(0:2), VP-(2:10), VP-(3:10), NP-(4:6), PP-(6:10), NP-(7,10)



Answer: The only node in the wrong position is node (yesterday, 10). The metrics are listed in the table below.

Correct Nodes	10
Candidate Nodes	11
Gold Standard Nodes	11
Precision	0.91
Recall	0.91
F1	0.91

Question 8

[Points 5] In transition-based parsing we see dependency structure were provided, then why we need to parse the sentence while given the structures?

Answer: Although the dependency structure is provided, we must perform transition-based parsing in order to find a derivation for the input sentence. In other words, we seek the configuration where the sentence can be represented as a dependency tree. If we can't form a derivation for the sentence, that means the sentence can not be interpreted with the provided dependency structure, and if this result is unexpected, we should reevaluate either the dependency structure or the sentence.

Question 9

[Points 5] What is CNF form? Why is Chomsky Normal Form used?

$S \rightarrow a X b X$
 $X \rightarrow a Y \mid b Y \mid \text{null}$
 $Y \rightarrow X \mid c$

Convert this CFG to CNF.

Answer: Chomsky Normal Form (CNF) is a method of representation for a context-free grammar. Generating rules in CNF follow one of the following rules:

- Rule must expand to two non-terminals.
- Rule must expand to exactly one terminal.

By adhering to CNF, we can use the Cocke-Kasami-Younger (CKY) algorithm to easily parse strings and see if they are in the language of the context-free grammar.

<p>1.</p> $S_0 \rightarrow S$ $S \rightarrow a X b X$ $X \rightarrow a Y \mid b Y \mid \epsilon$ $Y \rightarrow X \mid c$ <hr/> <p>2. remove $X \rightarrow \epsilon$</p> $S_0 \rightarrow S$ $S \rightarrow a X b X \mid a b$ $X \rightarrow a Y \mid b Y$ $Y \rightarrow X \mid c \mid \epsilon$ <hr/> <p>3. remove $Y \rightarrow \epsilon$</p> $S_0 \rightarrow S$ $S \rightarrow a X b X \mid a b$ $X \rightarrow a Y \mid b Y \mid a \mid b$ $Y \rightarrow X \mid c$	<p>4.</p> remove $S_0 \rightarrow S$ $S_0 \rightarrow a X b X \mid a b$ $S \rightarrow a X b X \mid a b$ $X \rightarrow a Y \mid b Y \mid a \mid b$ $Y \rightarrow X \mid c$ <hr/> remove $Y \rightarrow X$ $S_0 \rightarrow a X b X \mid a b$ $S \rightarrow a X b X \mid a b$ $X \rightarrow a Y \mid b Y \mid a \mid b$ $Y \rightarrow a Y \mid b Y \mid a \mid b \mid c$ <hr/>
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$S_0 \rightarrow aXbX | ab$
 $S \rightarrow aXbX | ab$
 $X \rightarrow aY | bY | a | b$
 $Y \rightarrow aY | bY | a | b | c$

remove terminals with non-terminates

$S_0 \rightarrow AXBX | AB$
 ~~$S \rightarrow AXBX | AB$~~
 $X \rightarrow AY | BY | a | b$
 $Y \rightarrow AY | BY | a | b | c$
 $A \rightarrow a$
 $B \rightarrow b$
 $F \rightarrow AB$

$S_0 \rightarrow GH | AB$
 $X \rightarrow AY | BY | a | b$
 $Y \rightarrow AY | BY | a | b | c$
 $A \rightarrow a$
 $B \rightarrow b$
 $F \rightarrow AB$
 $G \rightarrow AX$
 $H \rightarrow BX$

Final CNF grammar:

$S_0 \rightarrow GH | AB$
 $X \rightarrow AY | BY | a | b$
 $Y \rightarrow AY | BY | a | b | c$
 $A \rightarrow a$
 $B \rightarrow b$
 $G \rightarrow AX$
 $H \rightarrow BX$

Question 10

[Points 5] How would you encode sentence using deep neural network? Show details architecture of your network with an example sentence.

A recurrent neural network (RNN) may be used to encode a sentence. An RNN is similar to a feedforward network, but instead of a single linear layer, it has a hidden layer of recurrent units, which allows it to receive time-dependent inputs, such as how words in a sentence depend on the previous word. We can keep the output layer of the RNN as a fixed vector, and use it as a fixed feature vector for the sentence. In this way, we can use the RNN to encode sentences without having to learn a separate word embedding. If we wish, we may also use a decoder model in order to train our encoder. An example architecture for the encoder is shown below. For simplicity, there are only 2 hidden layers shown, but a neural network is considered deep when it has many hidden layers.

encoder model

Sentence \rightarrow "I saw the man"

