Context-free grammars and syntactic analysis

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- The largest phrase is the **sentence**
- We use **formal grammars** to describe these phrasal arrangements
- The formal grammatical description of a sentence gives us considerable inroads into understanding its meaning

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- A **derivation tree** T is the history of those rule applications.

Context-free Grammars: an example

Let our grammar (the rule-set R) be

S $\rightarrow$NP VP	Det$\rightarrow$ the
NP$\rightarrow$Det N	N $\rightarrow$ dog
NP$\rightarrow$NP PP	N $\rightarrow$ cat
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VP$\rightarrow$V	V $\rightarrow$ growled

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The nonterminal set N is $\{S, NP, VP, Det, N, P, V\}$, the terminal set V is $\{the, dog, cat, near, growled\}$, and our start symbol S is S.

Context-free Grammars: an example II

S	$\rightarrow$NP VP	Det	$\rightarrow$ the
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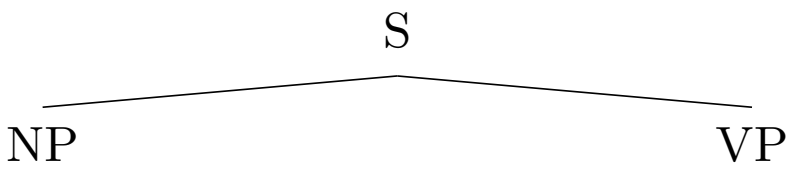

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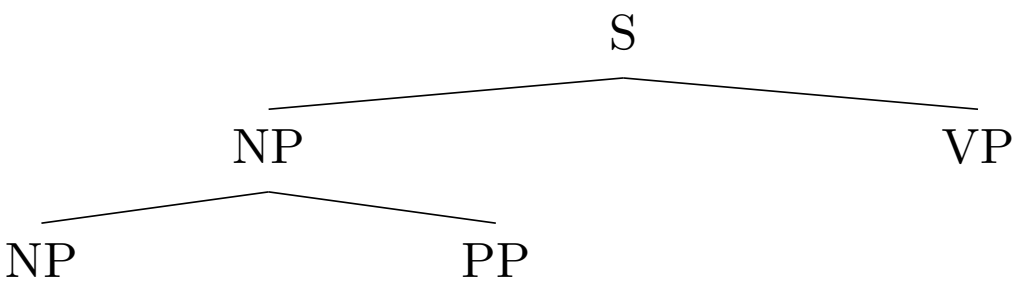

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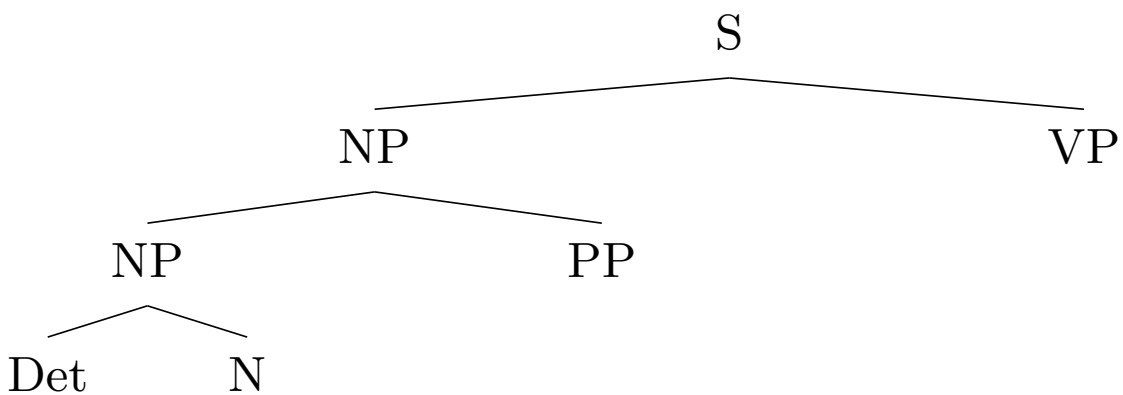

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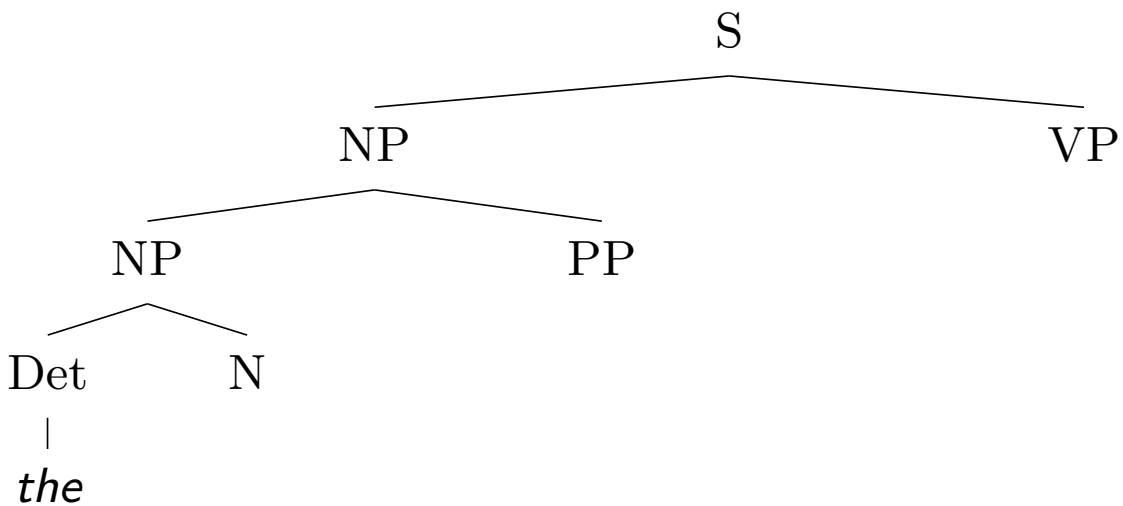

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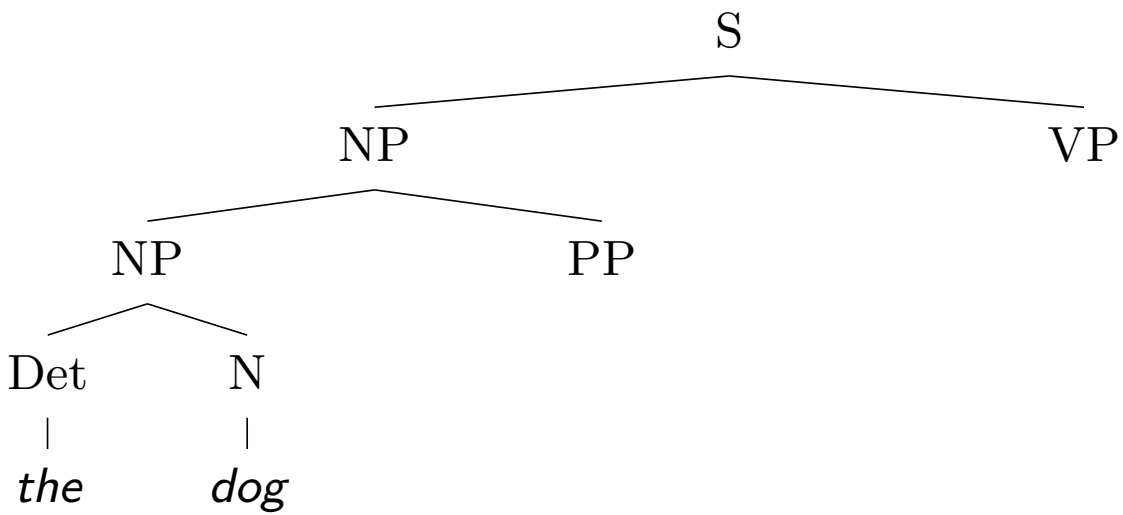

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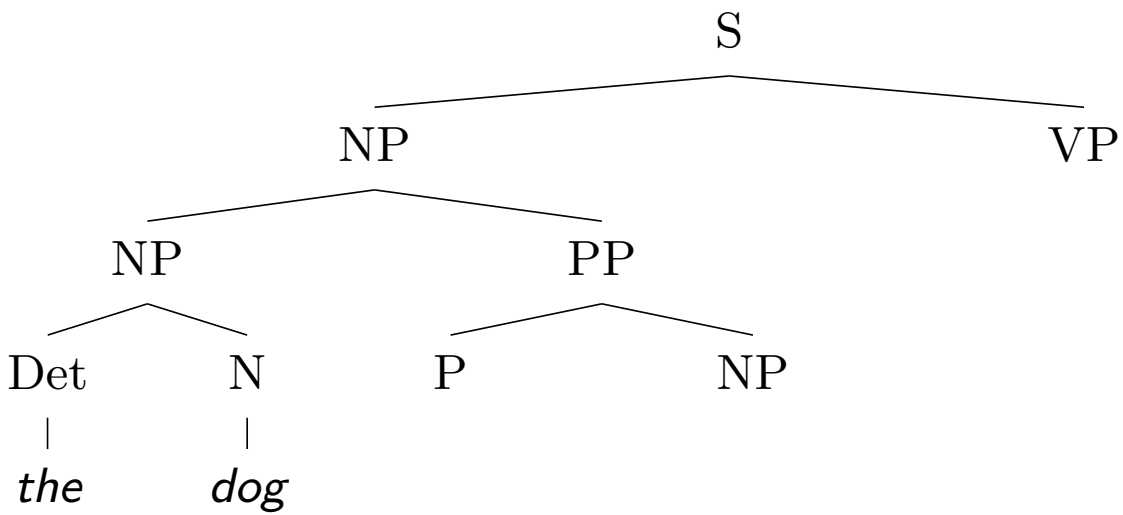

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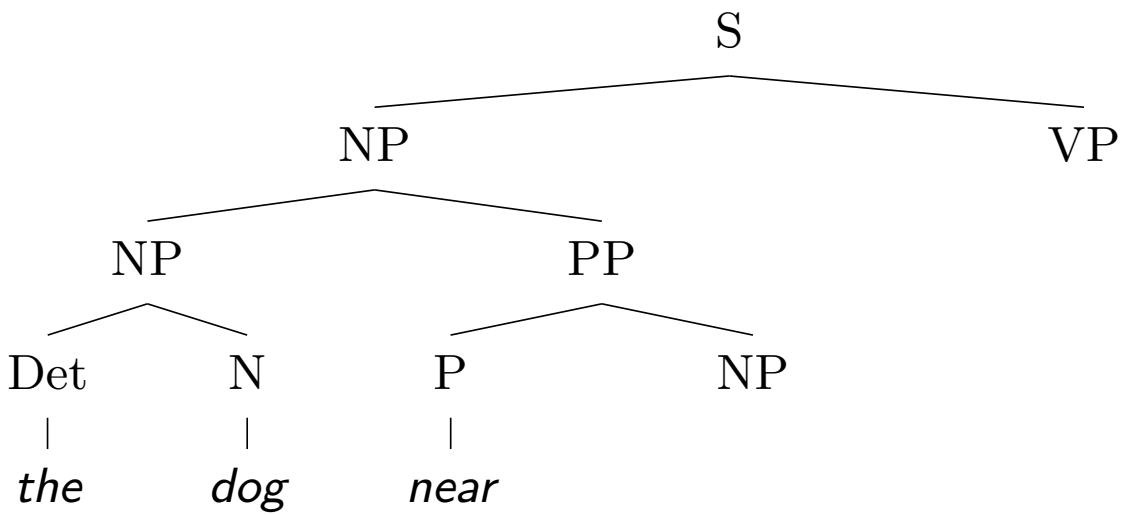

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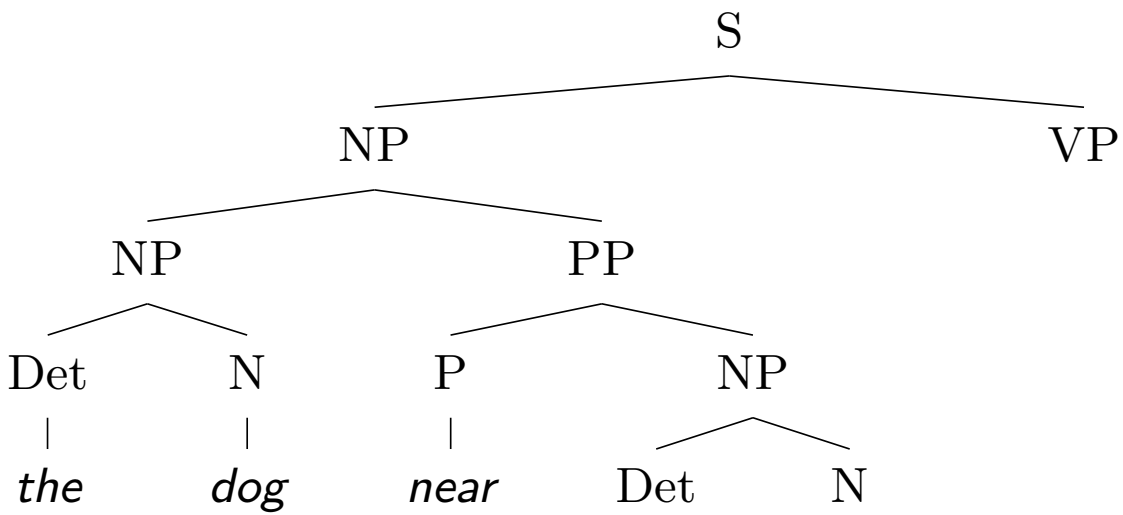

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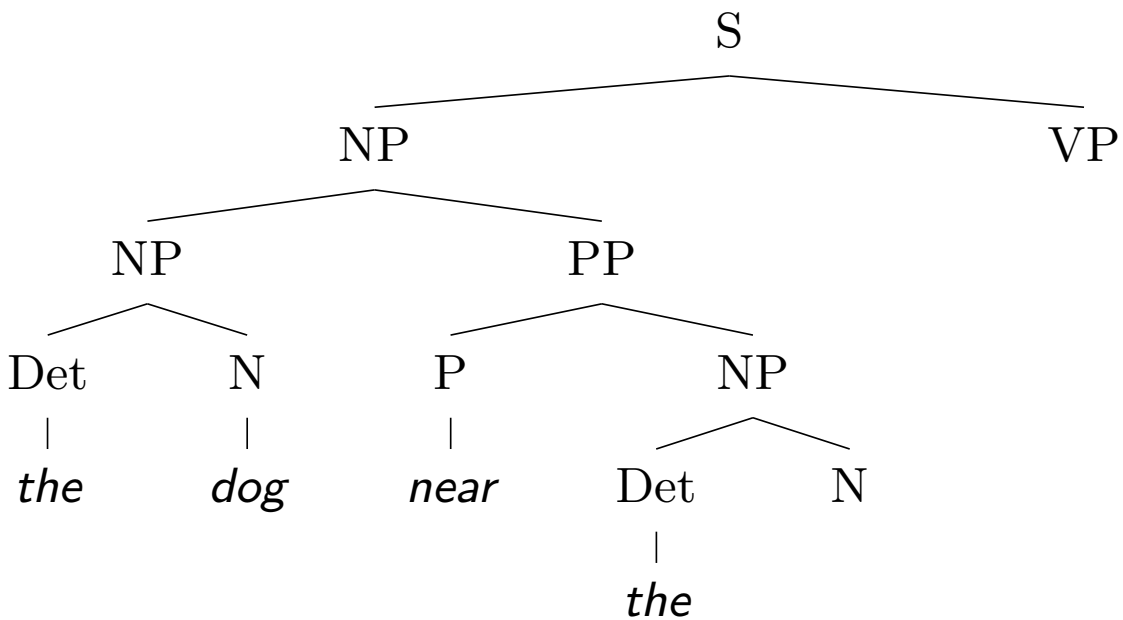

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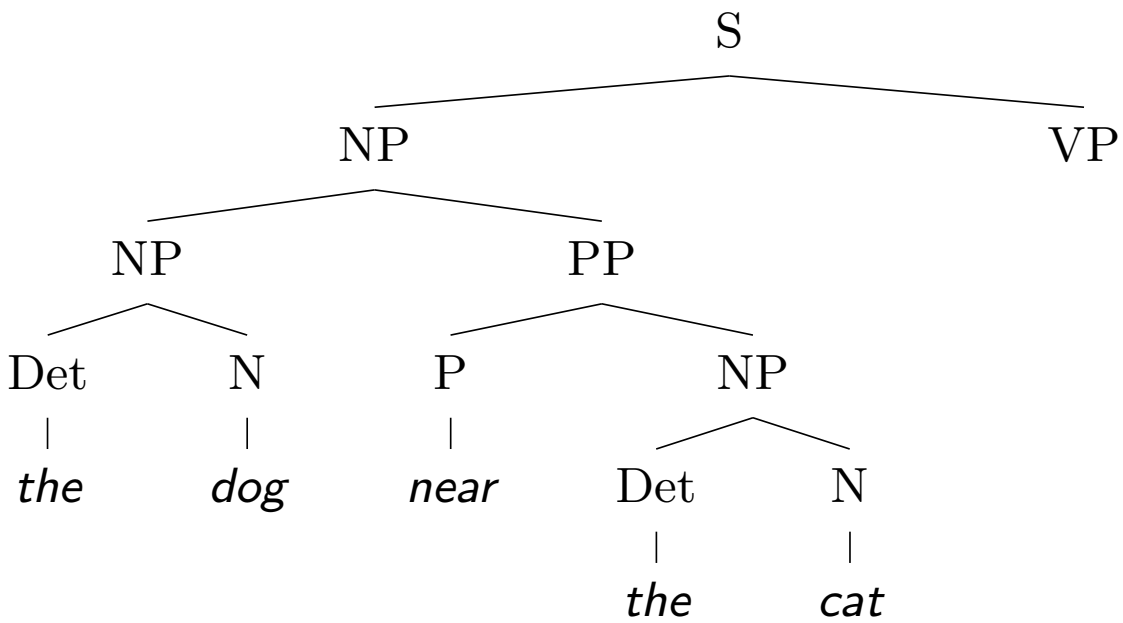

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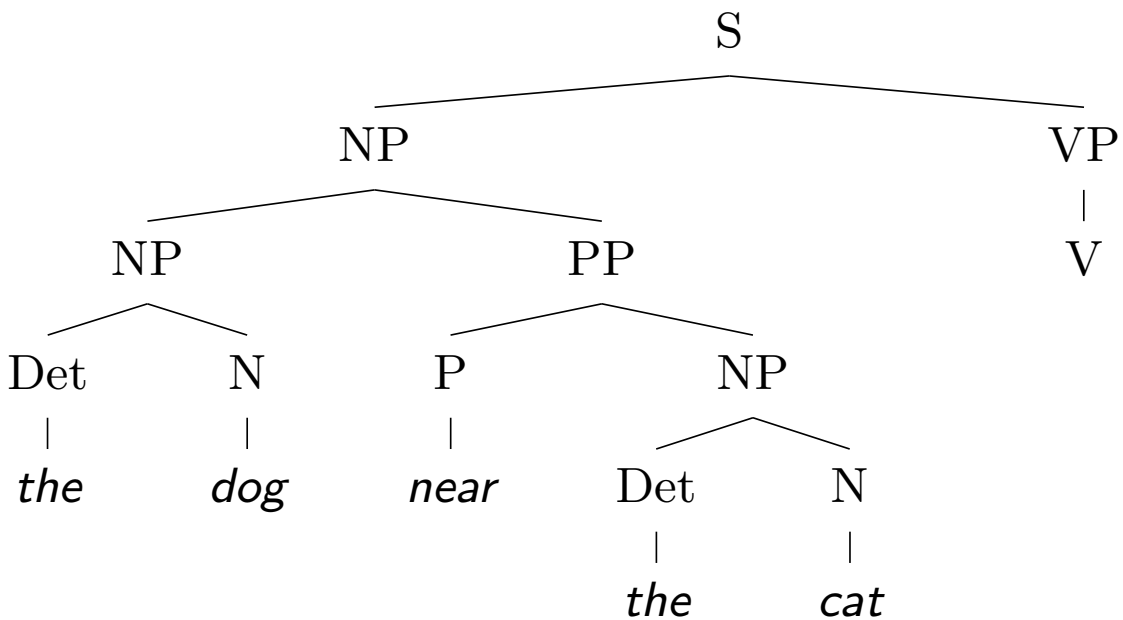

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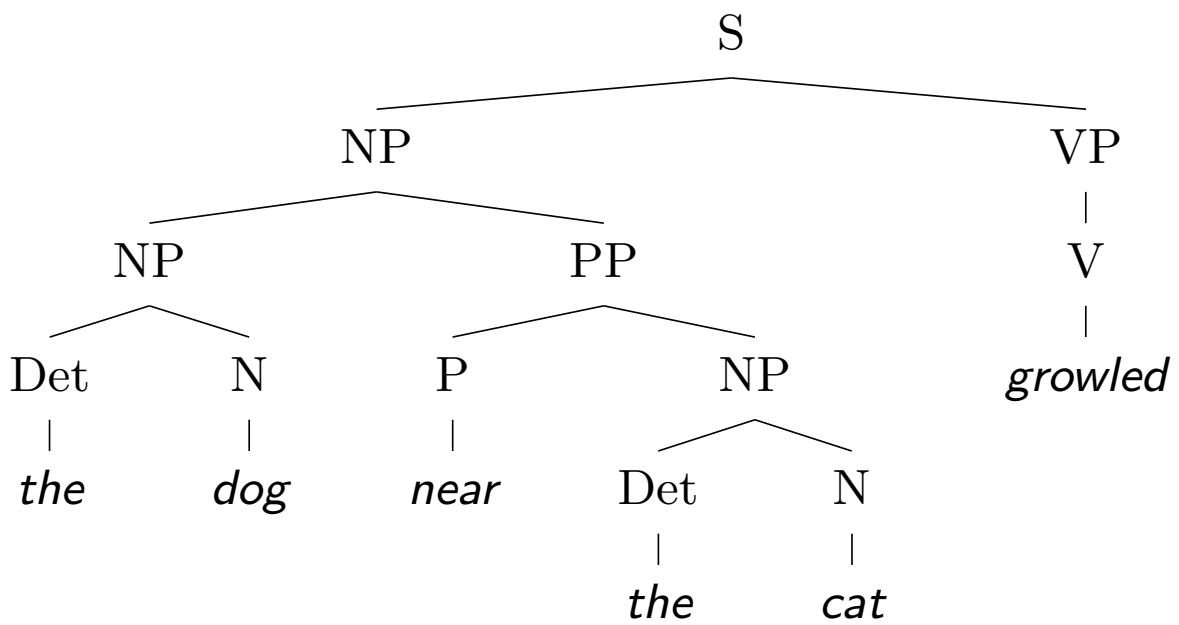
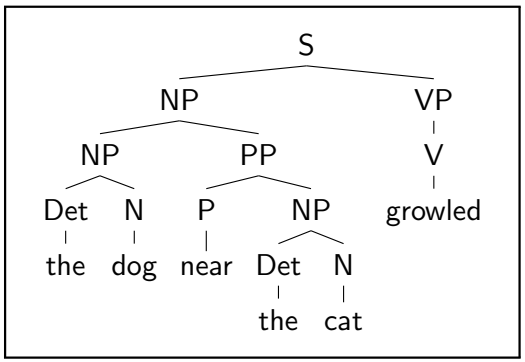


Some questions we can ask about a CFG

- How many strings does it produce?
- How many trees does it produce?
- Is it ambiguous? (in the general case, this problem is known to be UNDECIDABLE; Hopcroft & Ullman, 1979, Sima'an, 2002)

Context-free rules as generating phrase-structure descriptions



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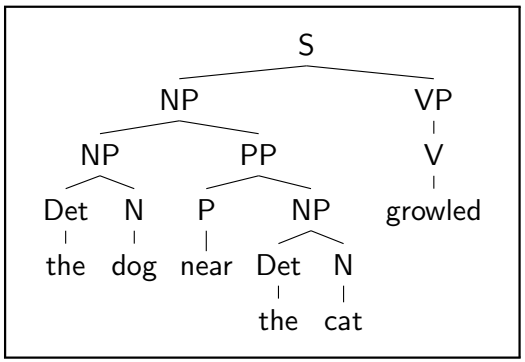

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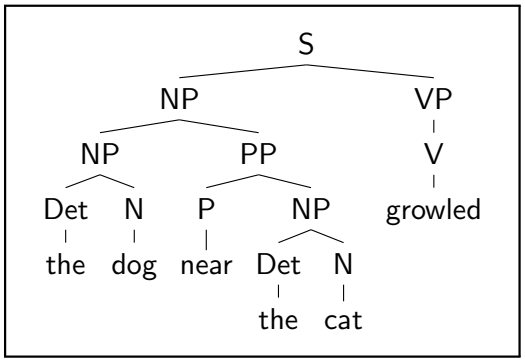

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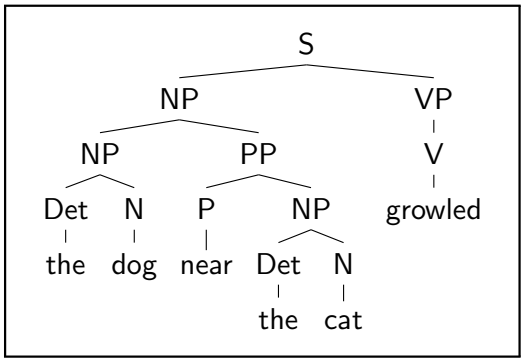

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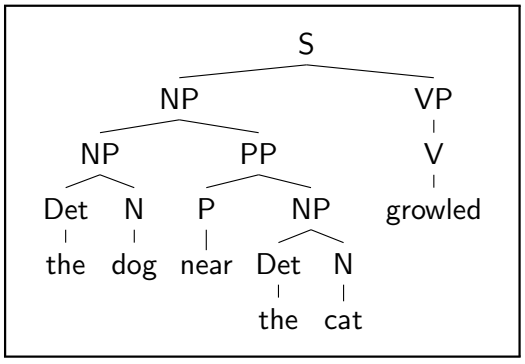

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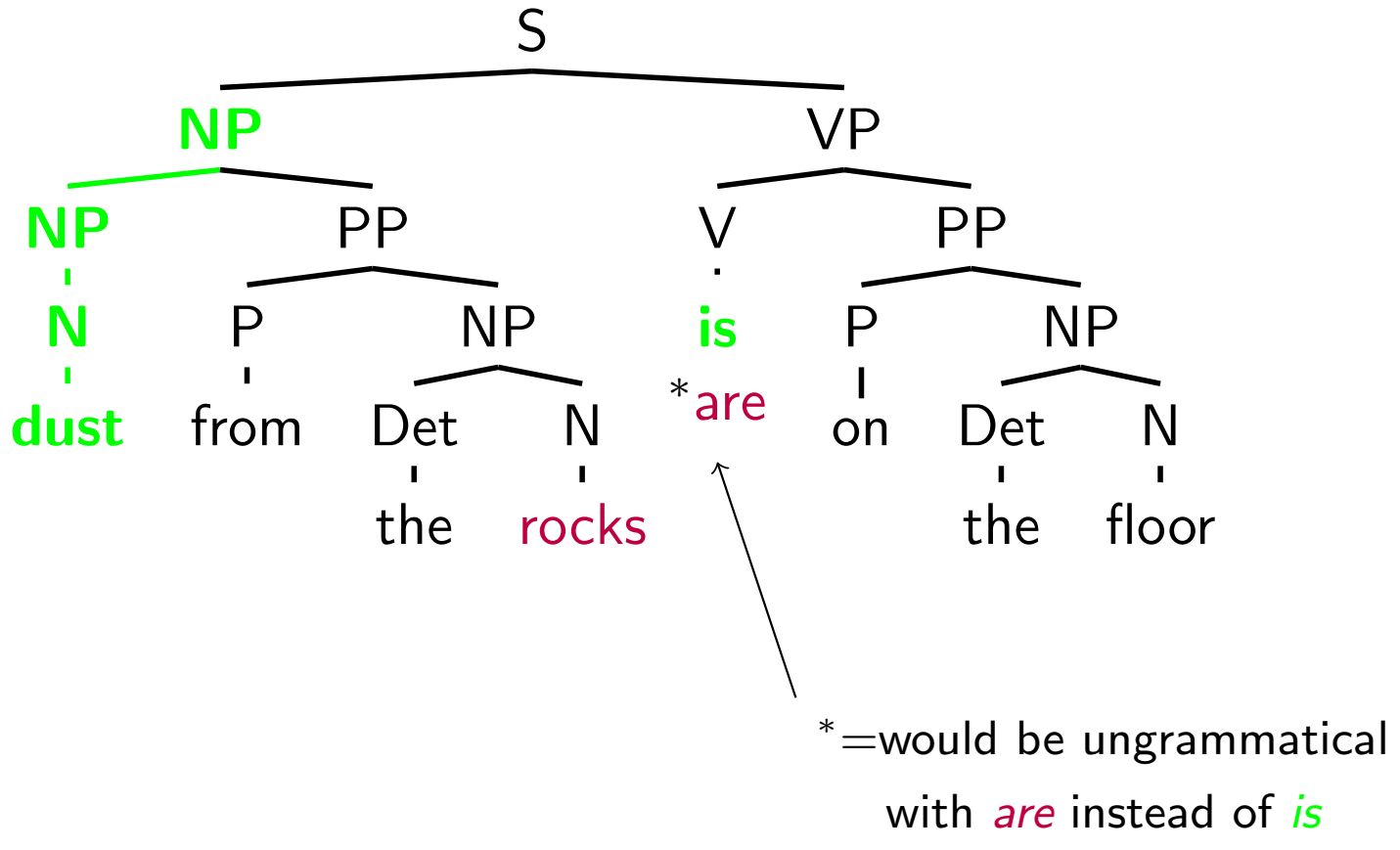
- These structural descriptions play a role in the theory of linguistic structure and meaning:
  - Syntactic regularities are theoretically stated in terms of these structural descriptions
  - Within the broader theory of linguistic structure, phrase structure also interfaces with other levels of representation, such as prosody and meaning composition

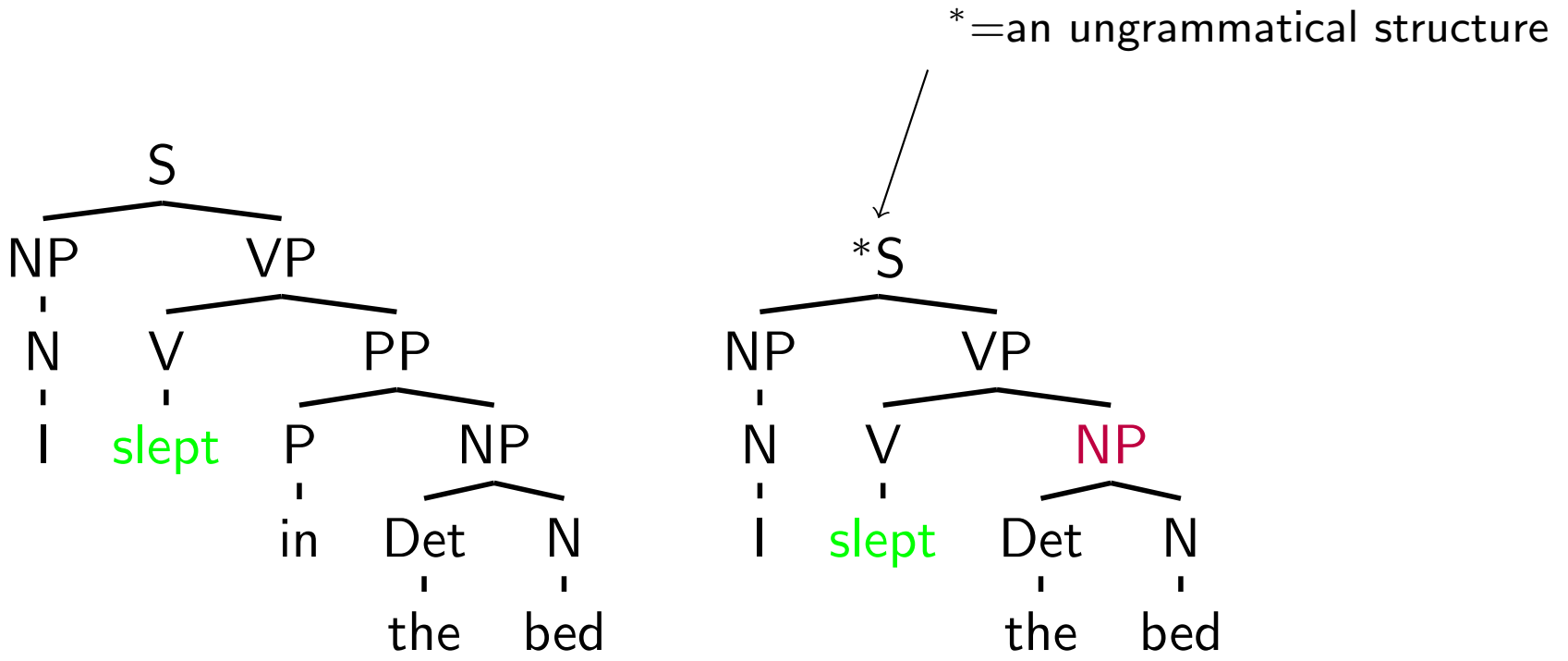
Syntactic regularities: subjects and subject–verb agreement

- The **subject** of an English clause is the NP left sister of the VP. The **head word** of a (non-coordinated) subject determines person+number agreement for the verb.



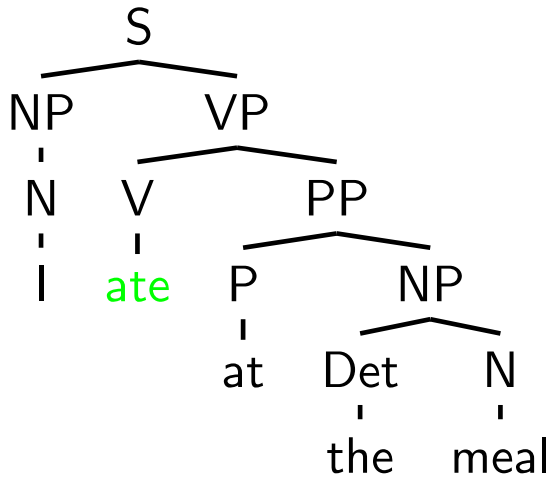
Syntactic regularities: argument structure

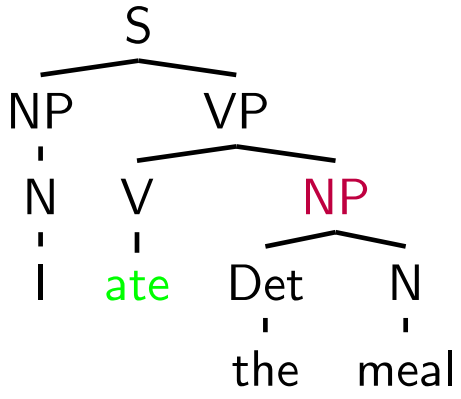
- Verbs differ in their **argument structure**, which constrains the English subject and children of the VP.

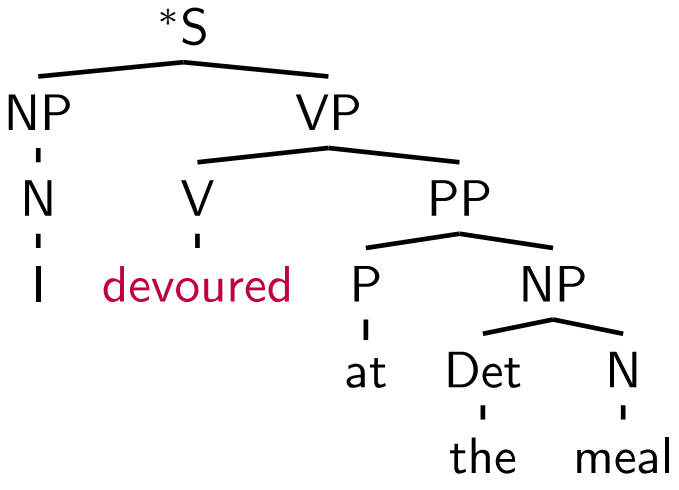


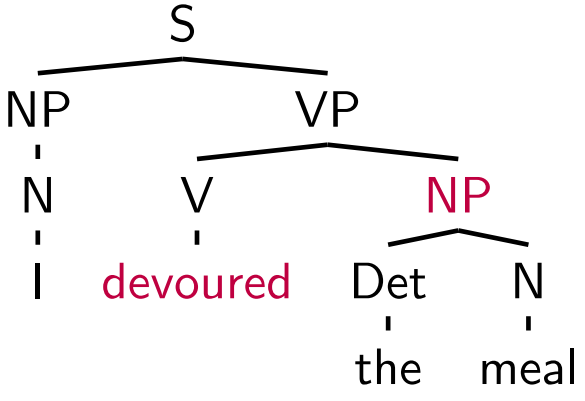
Syntactic regularities: argument structure

- Argument structure requirements are defined on **syntactic categories**, and are correlated with but not fully predictable from verb semantics:









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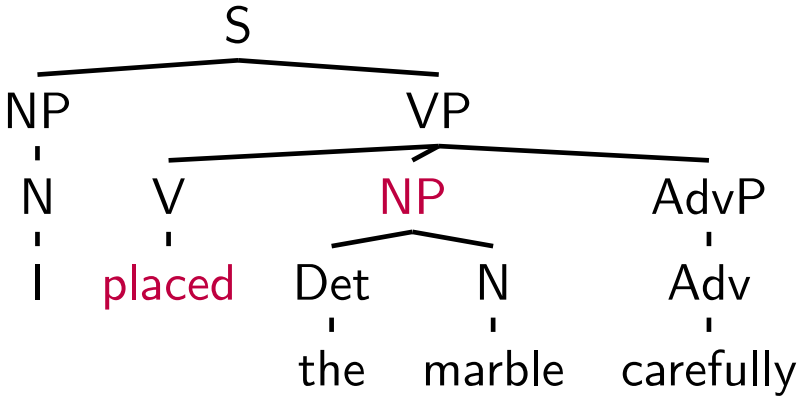
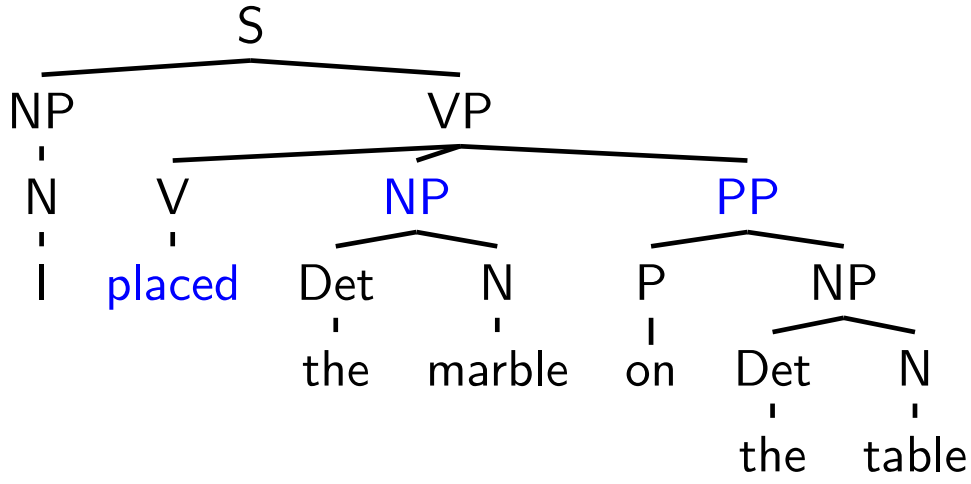
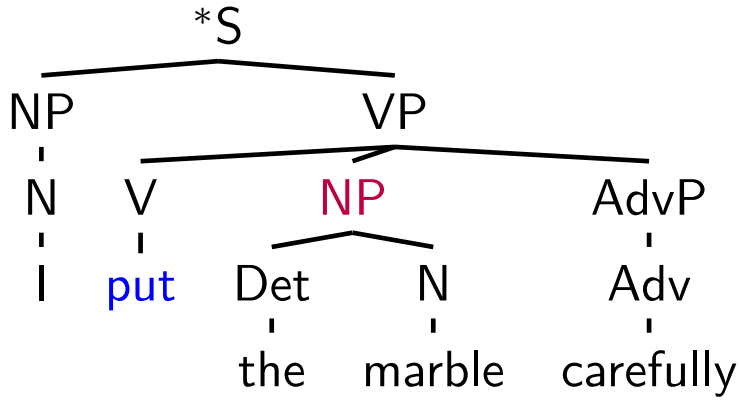
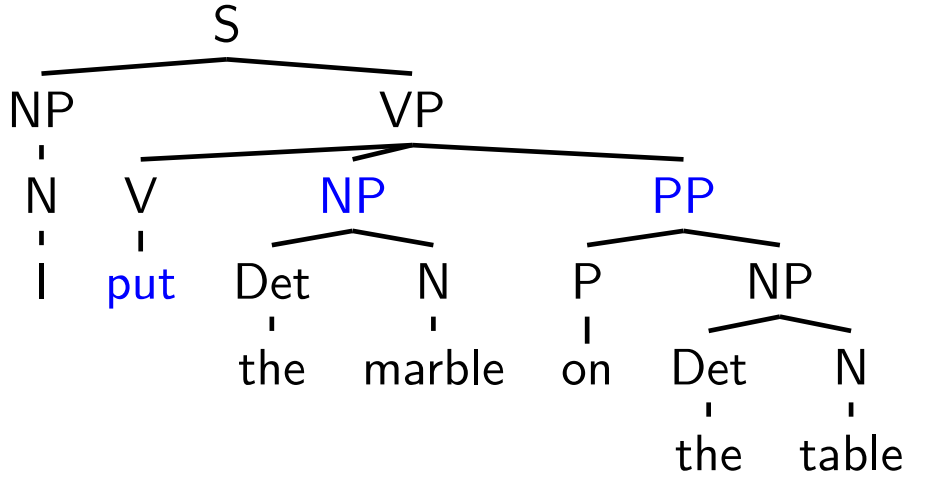
Argument structure requirements can be very verb-specific. For example, in English, *put* is the only verb that *requires* an explicit location argument:









Agreement & argument structure in CFGs

- Agreement, argument structure, and other constraints can be built into context-free grammars by adding **features** to phrasal categories, e.g.:

$VP \rightarrow V_{\langle\rangle}$	$V_{\langle\rangle} \rightarrow$ slept	$V_{\langle NP \rangle} \rightarrow$ devoured
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- Unlike arguments, **adjuncts** like *recently*, *with abandon*, and *at school* can combine very freely with verbs, so we also need rules like:

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- (**Note:** it's widely agreed that there is *some* distinction between arguments and adjuncts, and many cases are clear, but some other cases are harder to classify!)
- **Recommended exercise:** work out how to use features to start build agreement constraints into a context-free grammar for English

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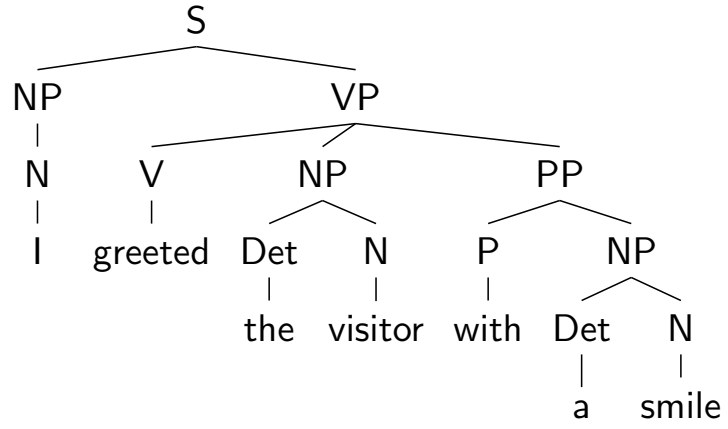
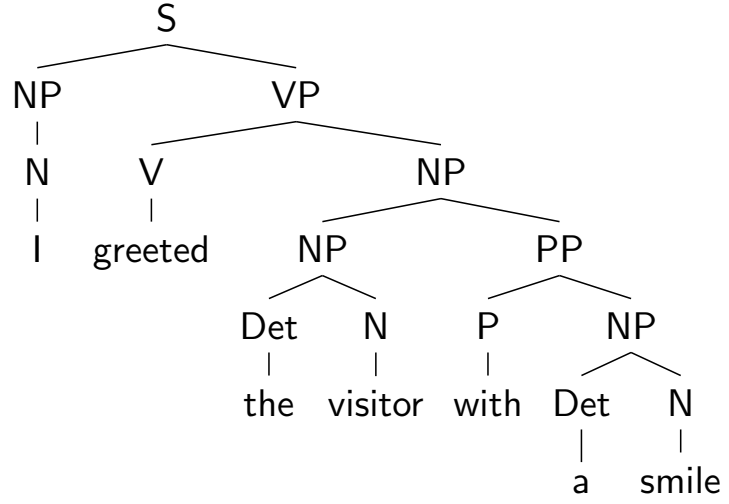
- **Relation with syntax:** for the most part (and possibly entirely!), meaning composition occurs via the hierarchy of the syntactic tree.
- This means that syntax immediately gives us an account of many meaning ambiguities. For example:



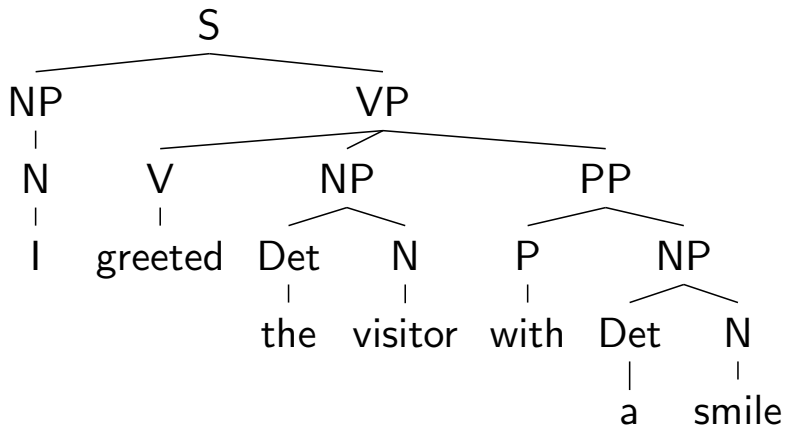
"I smiled as I greeted the visitor"

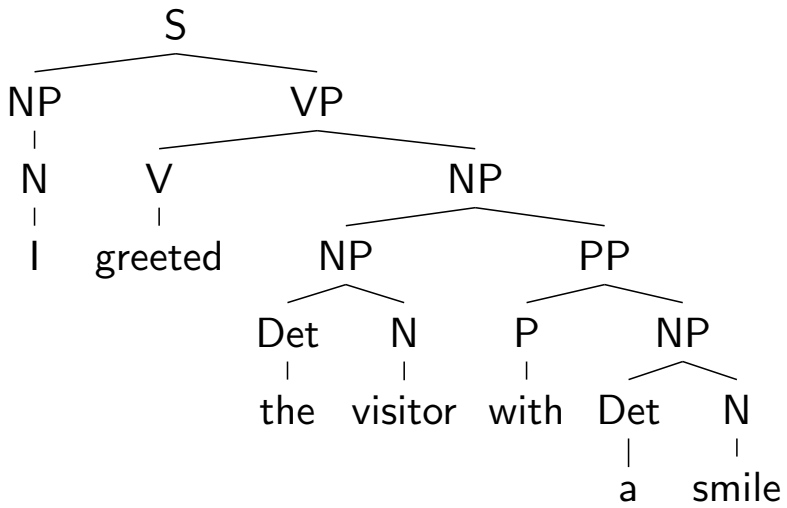


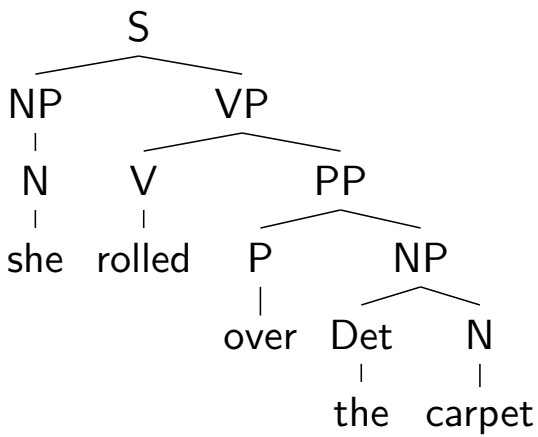
"I greeted the visitor that was smiling"

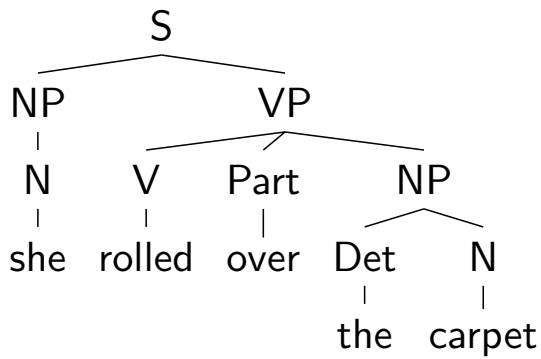
The phrase structure–prosody interface

- Phrasal boundaries (N**P**, V**P**, P**P**) often correspond with prosodic breaks (Lehiste et al., 1976):









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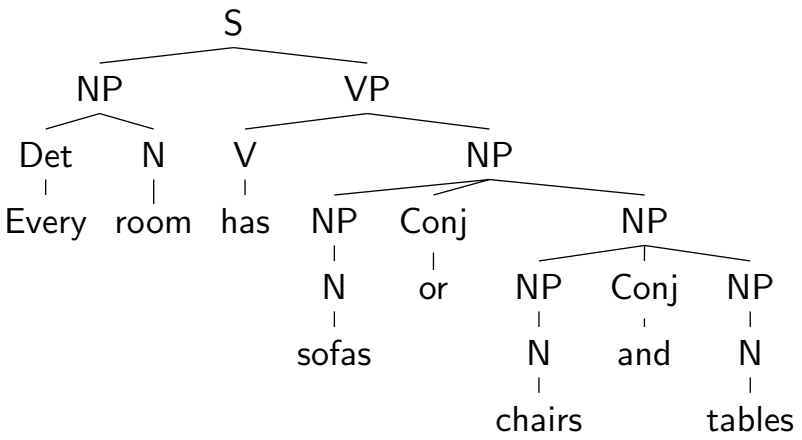

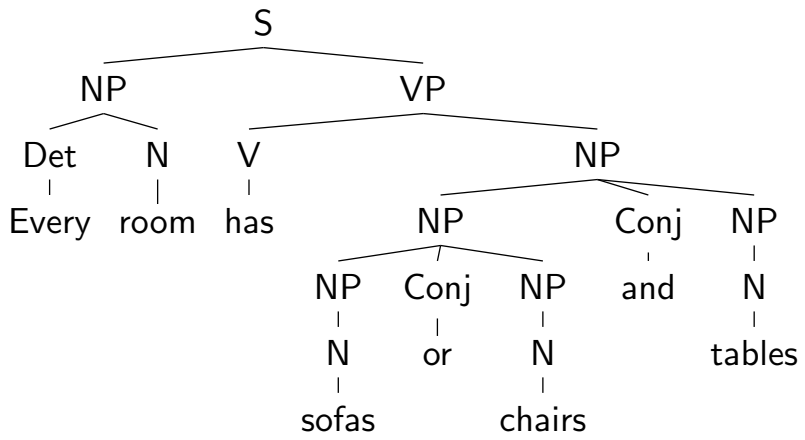

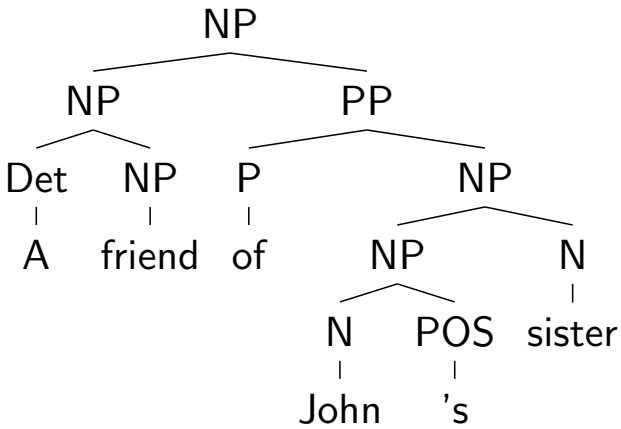

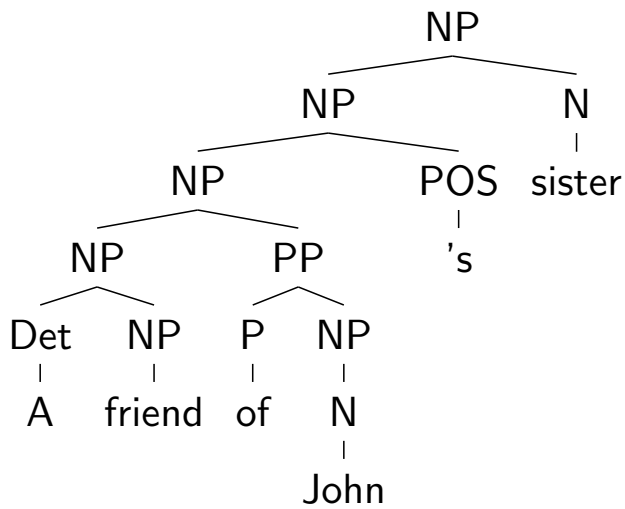

Revisiting problem case studies for finite-state models

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  - Nested *if/then* sentences

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if students work hard, then they generally do well in class.
if if students work hard, then they generally do well in class, then the teacher is rewarded.
if if if students work hard, then they generally do well in class, then the teacher is rewarded,
then the university is well-run.
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  - Multiply center-embedded object-extracted relative clauses

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the rock can be found in the garden.
the rock that the squirrel likes can be found in the garden.
the rock that the squirrel that the dog chases likes can be found in the garden.
the rock that the squirrel that the dog that the woman owns chases likes can be found in the
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- We will now revisit each case with context-free grammars

Multiple PP attachment

S	$\rightarrow$NP VP	Det	$\rightarrow$ the
NP	$\rightarrow$Det N	N	$\rightarrow$ dog
NP	$\rightarrow$NP PP	N	$\rightarrow$ cat
PP	$\rightarrow$P NP	P	$\rightarrow$ near
VP	$\rightarrow$V	V	$\rightarrow$ growled

We just add the required lexical rewrite rules to the grammar we already specified, and we're all set!

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Multiple PP attachment

S $\rightarrow$NP VP	Det$\rightarrow$ the	Det$\rightarrow$a	N$\rightarrow$ street
NP$\rightarrow$Det N	N $\rightarrow$ dog	Det$\rightarrow$an	P$\rightarrow$ about
NP$\rightarrow$NP PP	N $\rightarrow$ cat	N $\rightarrow$joke	P$\rightarrow$ with
PP$\rightarrow$P NP	P $\rightarrow$ near	N $\rightarrow$woman	P$\rightarrow$ on
VP$\rightarrow$V	V $\rightarrow$ growled	N $\rightarrow$umbrella	

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Multiple PP attachment

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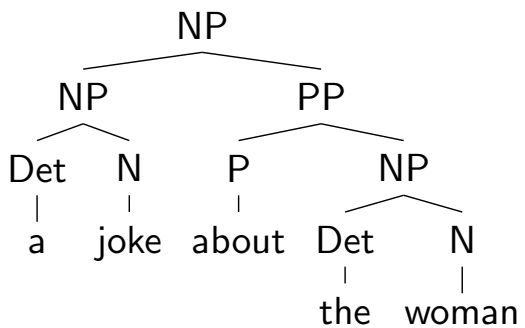

Multiple PP attachment

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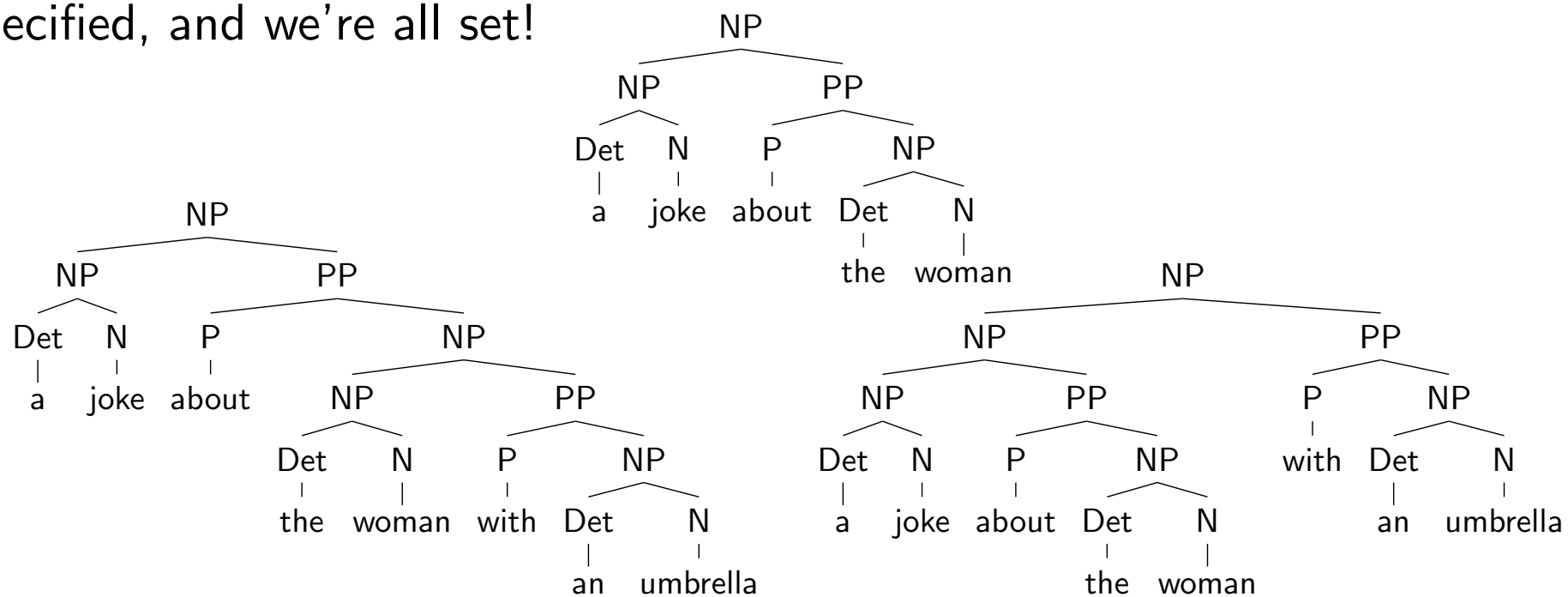

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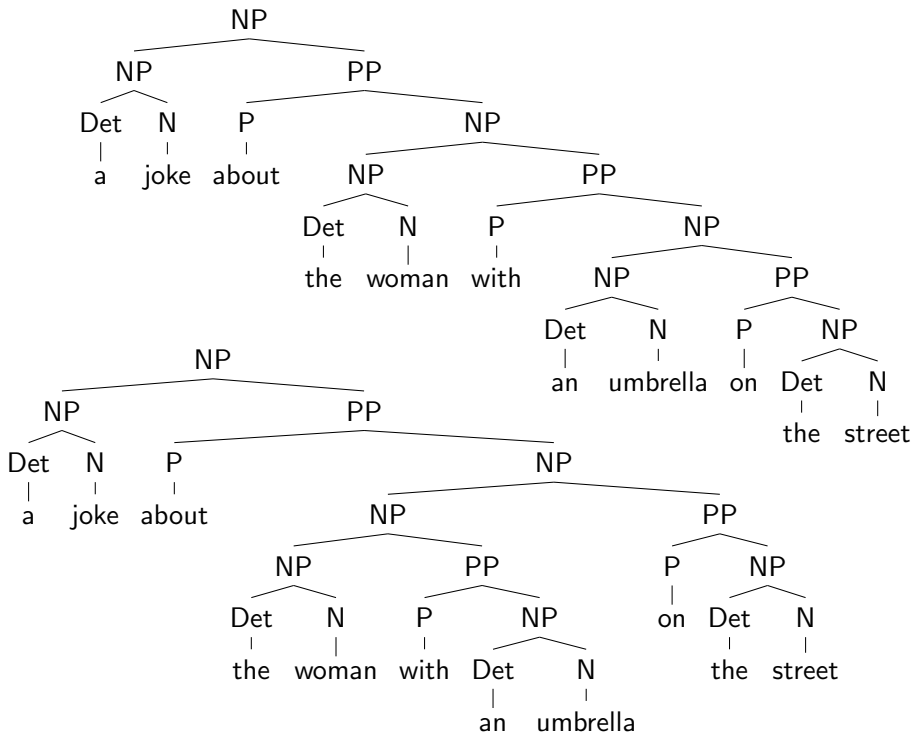
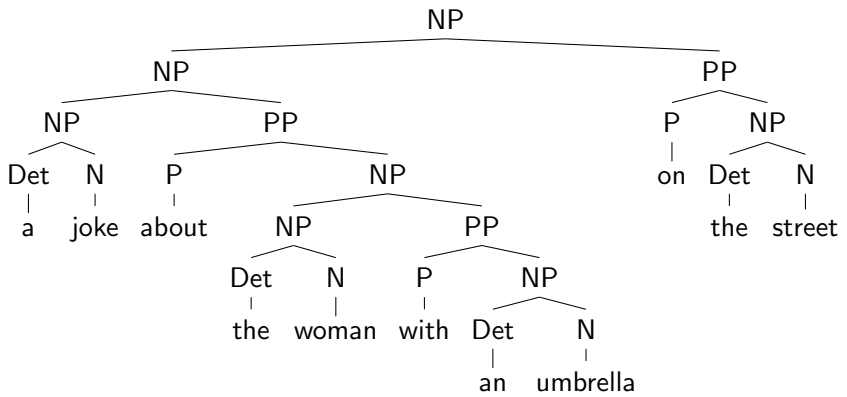
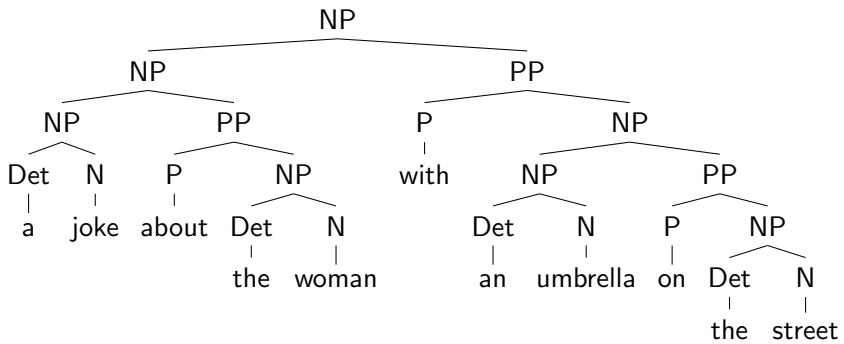
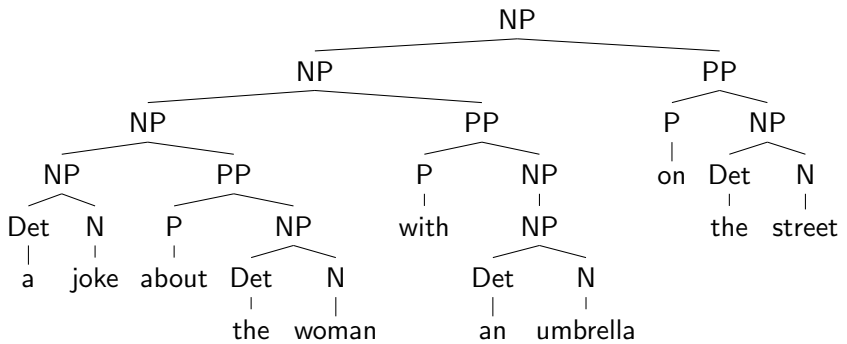








⋮

Nested *if/then* sentences

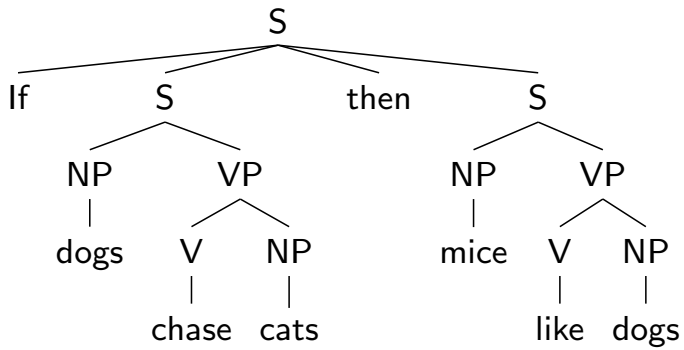
S $\rightarrow$ NP VP	NP $\rightarrow$ dogs	V $\rightarrow$ chase
VP $\rightarrow$ V NP	NP $\rightarrow$ cats	V $\rightarrow$ watch
S $\rightarrow$ If S then S	NP $\rightarrow$ mice	V $\rightarrow$ seek

Nested *if/then* sentences

$S \rightarrow NP\ VP$
$VP \rightarrow V\ NP$
$S \rightarrow If\ S\ then\ S$

$NP \rightarrow dogs$
$NP \rightarrow cats$
$NP \rightarrow mice$

$V \rightarrow chase$
$V \rightarrow watch$
$V \rightarrow seek$



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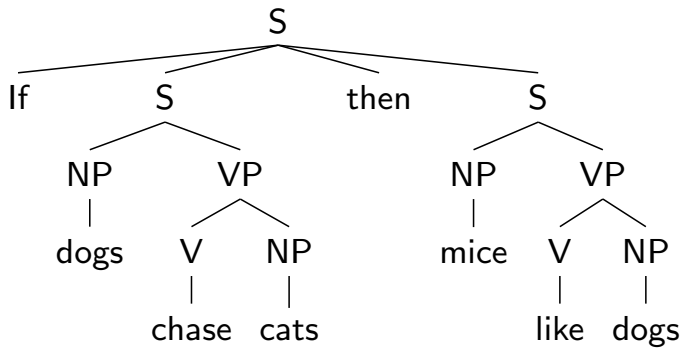

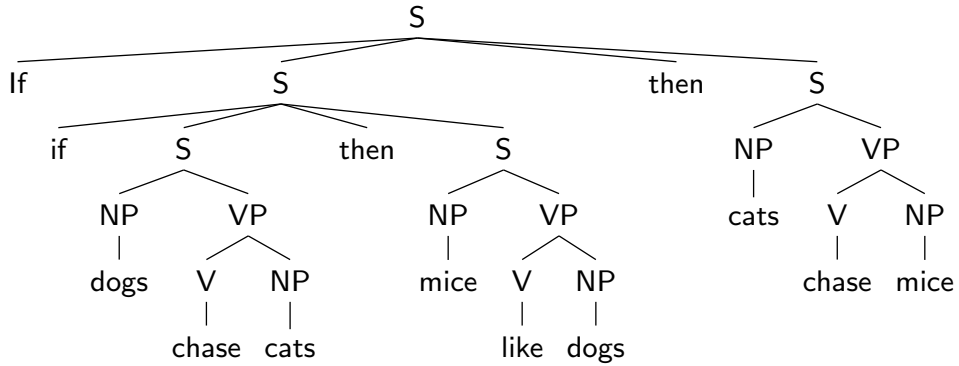

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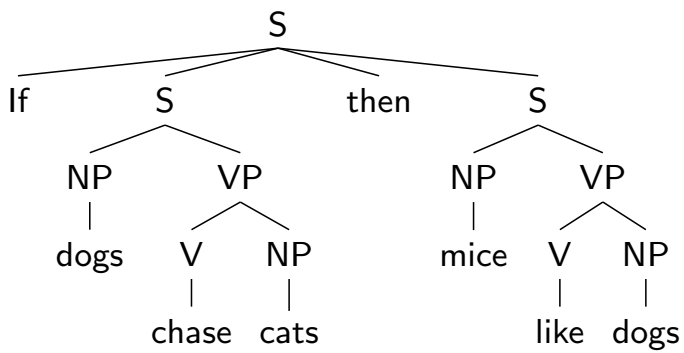

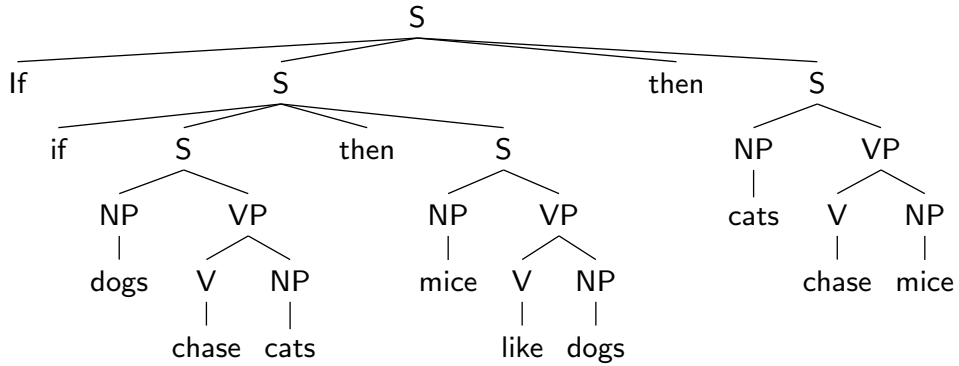

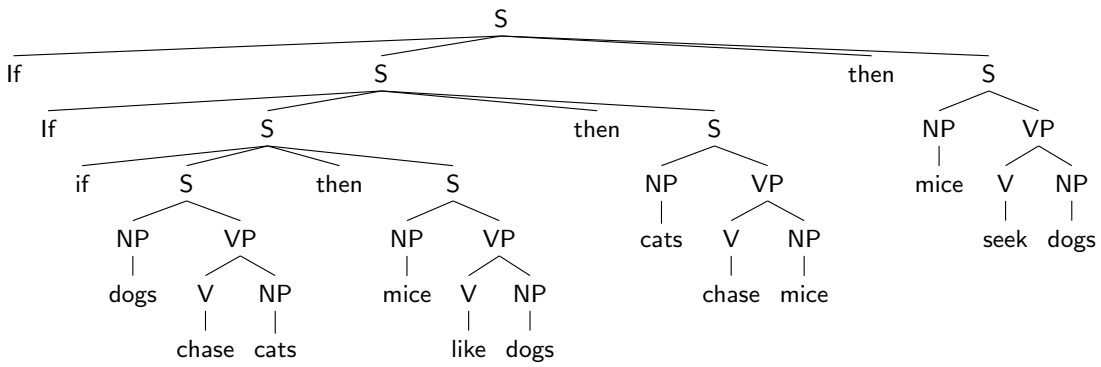

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