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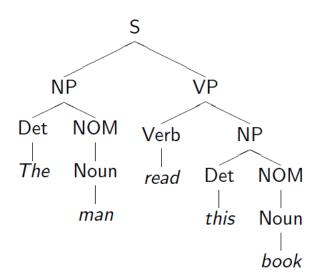
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Syntax Tree: Example



Defining the notions: Constituency

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Constituency: Noun Phrase

- Kermit the frog
- they
- December twenty-sixth
- the reason he is running for president

killed the rabbit

Usually named based on the word that heads the constituent:

the man from Amherst is a Noun Phrase (NP) because the head man is a noun extremely clever is an Adjective Phrase (AP) because the head clever is an adjective down the river is a Prepositional Phrase (PP) because the head down is a preposition

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Joe appears in a place that a larger noun phrase could have been.

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Kermit the frog comes on stage

They come to Massachusetts every summer

 \overline{Dece} mber twenty-sixth comes after Christmas

The reason he is running for president comes out only now.

But not each individual word in the consituent

 $*\underline{The}$ comes our... $*\underline{is}$ comes out... *for comes out...

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Consituent = Prepositional phrase: On December twenty-sixth

On December twenty-sixth I'd like to fly to Florida.

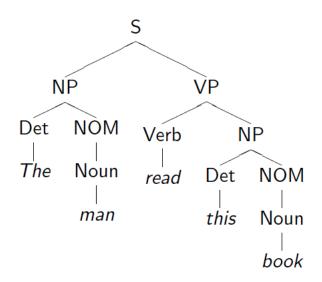
I'd like to fly on December twenty-sixth to Florida.

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But not split apart

- * On December I'd like to fly twenty-sixth to Florida.
- *On I'd like to fly December twenty-sixth to Florida.

Modeling Constituency: what tool do we need?



Context-free grammar

The most common way of modeling constituency

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Noun phrase can be composed of either a ProperNoun or a determiner (Det) followed by a Nominal; a Nominal can be more than one nouns

NP → Det Nominal

 $NP \rightarrow ProperNoun$

Nominal → Noun | Noun Nominal

CFG: G = (T, N, S, R)

- T: set of terminals
- N: set of non-terminals
 - For NLP, we distinguish out a set $P \subset N$ of pre-terminals, which always rewrite as terminals
- S: start symbol
- *R*: Rules/productions of the form $X \to \gamma$, $X \in N$ and $\gamma \in (T \cup N)*$

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Can you identify the terminal, non-terminals and preterminals?

CFG as a generator

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Thus a CFG can be used to randomly generate a series of strings

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Generating 'a flight':

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- Thus a CFG can be used to randomly generate a series of strings
- This sequence of rule expansions is called a derivation of the string of words, usually represented as a tree

CFGs and Grammaticality

A CFG defines a formal language = set of all sentences (string of words) that can be derived by the grammar

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- Sentences in this set are said to be grammatical
- Sentences outside this set are said to be ungrammatical

CFGs and Recursion

Recursive Definition

- PP → Prep NP
- NP → Noun PP

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Example Sentence

[$_S$ The mailman ate his [$_{NP}$ lunch [$_{PP}$ with his friend [$_{PP}$ from the cleaning staff [$_{PP}$ of the building [$_{PP}$ at the intersection [$_{PP}$ on the north end [$_{PP}$ of town]]]]]]].

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$A \rightarrow BC$

- I can rewrite A as B followed by C regardless of the context in which A is found
- Or when I see a B followed by a C, I can infer an A regardless of the surrounding context