### CL1

Syntax, Context-Free Grammar, and Constituency Parsing

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    - I am happy. (Well-formed)
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  - Syntax helps identify these grammatical errors by enforcing the structure.

## **Key Concepts in Syntax**

- Syntactic Categories: These are categories of words that have similar syntactic behavior.
  - Lexical Categories: These include content words such as:
    - Nouns: Refers to people, objects, or ideas (e.g., boy, school, idea).
    - Verbs: Describes actions or states (e.g., run, think, is).
    - Adjectives: Provides descriptive qualities of nouns (e.g., big, red, fast).
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    - Adverbs: Modifies verbs, adjectives, or other adverbs (e.g., quickly, very, always).
  - Functional Categories: These serve grammatical purposes and include:
    - Determiners: Specifies a noun (e.g., the, a, an).
    - Prepositions: Shows relationships between nouns (e.g., in, on, under).
    - Conjunctions: Connects words, phrases, or clauses (e.g., and, but, because).

#### • Example:

- The cat sat on the mat.
  - The (Determiner), cat (Noun), sat (Verb), on (Preposition), the mat (Noun Phrase).



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- Noun Phrase (NP):
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  - Examples:
    - John (Simple NP)
    - The little boy (NP with Determiner and Adjective)
    - The cat on the mat (NP with Prepositional Phrase)
  - $\bullet \ \, \textbf{Phrase structure rule:} \ \, \mathsf{NP} \to (\mathsf{Det}) \; (\mathsf{Adj})^* \; \mathsf{N} \; (\mathsf{PP}) \\$

- Verb Phrase (VP):
  - A phrase that includes a verb and its complements or modifiers.

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  - Examples:
    - She runs (Simple VP)
    - John sang a song (VP with Object)
    - John sang a song in the shower (VP with Prepositional Phrase)
  - Phrase structure rule:  $VP \rightarrow V (NP)^* (PP) (Adv)^*$

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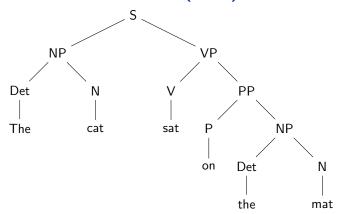
## Prepositional Phrase (PP):

 A phrase that begins with a preposition and is followed by a noun phrase.

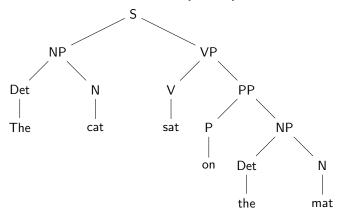
- Prepositional Phrase (PP):
  - A phrase that begins with a preposition and is followed by a noun phrase.
  - Examples:
    - in the house
    - with a friend
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- It breaks down a sentence into its constituent parts, or phrases, which are categorized into syntactic types (e.g., NP, VP, PP).
- Example Sentence: The cat sat on the mat.



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#### • Phrase Structure Rule:

$$S \rightarrow NP \ VP$$
 
$$NP \rightarrow Det \ N$$
 
$$VP \rightarrow V \ PP$$
 
$$PP \rightarrow P \ NP$$

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- S → NP VP
- Example:
  - The dog barked.
  - NP = The dog
  - VP = barked
- A sentence is ill-formed if it does not follow this basic structure.
- Example of III-formed Sentences:
- \*The dog. (Missing VP)
- \*Barked (Missing NP)



## **Types of Clauses and Sentences**

### Types of Clauses:

- Independent Clause: A clause that can stand alone as a sentence (e.g., *I went to the store*).
- Dependent Clause: A clause that cannot stand alone and depends on the main clause (e.g., If I go out).

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### Types of Sentences:

- Simple Sentence: Contains one independent clause (e.g., I like pizza).
- Compound Sentence: Contains two or more independent clauses (e.g., I like pizza and he likes pasta).
- Complex Sentence: Contains one independent clause and at least one dependent clause (e.g., I laughed when he fell).
- Compound-Complex Sentence: Contains at least two independent clauses and one or more dependent clauses (e.g., I laughed when he fell, but he was fine).

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### • Ambiguities:

- Structural Ambiguity: Occurs when a sentence can be parsed in more than one way (e.g., *I saw a man with a telescope*).
- Coordination Ambiguity: When the scope of conjunctions like "and" is unclear (e.g., old men and women).

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#### • Ellipsis:

Omission of words that are understood in context (e.g., I did it; he didn't).

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- A designated start symbol (often *S* for "sentence").
- Example:
- $S \rightarrow NP \ VP$  (A sentence consists of a noun phrase and a verb phrase)



## **CFG** Rules and Example

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- NP → Det Nominal (A noun phrase can be a determiner followed by a nominal).
- VP → Verb NP (A verb phrase can be a verb followed by a noun phrase).
- Nominal → Noun | Nominal Noun (A nominal can be a noun or a series of nouns).
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- The symbols on the left of the arrow are non-terminal symbols, while those on the right can be terminals or non-terminals.
- Example:
- ullet NP o Det Nominal o Det Noun o the flight
- This means that "the flight" is a valid noun phrase.



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 Parse Trees are graphical representations of the syntactic structure of a sentence.

• Each node represents a symbol, and its children represent what it can be rewritten into CFG rules.

# Parsing with CFG and Parse Trees

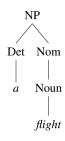
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# **Example of Parsing: "a flight"**

- Example: Parsing "a flight"
- ullet NP o Det Nominal
- Det  $\rightarrow a$
- ullet Nominal o Noun
- Noun  $\rightarrow$  flight
- This generates the following parse tree:



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- We can use the or-symbol '|' to indicate that a non-terminal has alternate possible expansions.

Figure 1: The lexicon for  $\mathcal{L}_0$ 

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Grammar	Rules	Examples
$S \rightarrow$	NP VP	I + want a morning flight
ND .	Pronoun	T
$NP \rightarrow$		I v
	Proper-Noun	Los Angeles
	Det Nominal	a + flight
Nominal $\rightarrow$	Nominal Noun	morning + flight
	Noun	flights
$V\!P \;  ightarrow$	Verh	do
, , , , , , , , , , , , , , , , , , ,	Verb NP	want + a flight
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Figure 2: The grammar for  $\mathcal{L}_0$ , with example phrases for each rule.

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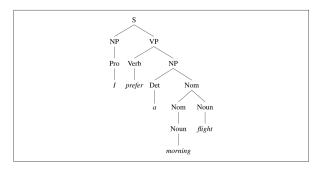


Figure 3: The parse tree for "I prefer a morning flight" according to grammar  $\mathcal{L}_0$ 

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#### Parse Tree

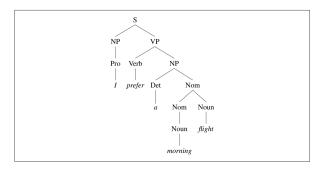


Figure 3: The parse tree for "I prefer a morning flight" according to grammar  $\mathcal{L}_0$ 

- We can also represent a parse tree in a more compact format called bracketed notation. Here is the bracketed representation of the parse tree from the figure above:
- [S[NP[ProI]][VP[Vprefer][NP[Deta][Nom[Nmorning][Nom[Nflight]]]]]]

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- **Grammar Extraction:** Sentences in a treebank implicitly constitute a grammar of the language, allowing extraction of CFG rules.

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### **Penn Treebank Sentences**

```
((S
   (NP-SBJ (DT That)
                                    ((S
     (JJ cold) (, .)
                                        (NP-SBJ The/DT flight/NN )
     (JJ empty) (NN sky) )
                                        (VP should/MD
   (VP (VBD was)
                                          (VP arrive/VB
     (ADJP-PRD (JJ full)
                                            (PP-TMP at/IN
       (PP (IN of)
                                              (NP eleven/CD a.m/RB ))
         (NP (NN fire)
                                            (NP-TMP tomorrow/NN )))))
           (CC and)
           (NN light) ))))
   (...)
               (a)
                                                       (b)
```

Figure 4: Parses from the LDC Treebank3

## Penn Treebank

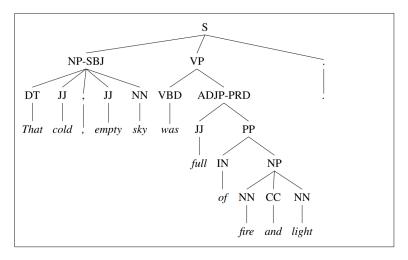


Figure 5: The tree corresponding to the Brown corpus sentence in the previous figure.

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### Penn Treebank

Grammar	Lexicon
$S \rightarrow NP VP$ .	$DT \rightarrow the \mid that$
$S \rightarrow NP VP$	$JJ \rightarrow cold \mid empty \mid full$
$\mathit{NP}  ightarrow  \mathit{DTNN}$	$NN \rightarrow sky \mid fire \mid light \mid flight \mid tomorrow$
$\mathit{NP}  ightarrow \mathit{NN} \mathit{CC} \mathit{NN}$	$CC \rightarrow and$
NP  ightarrow DTJJ , $JJNN$	$IN \rightarrow of \mid at$
$N\!P  o N\!N$	CD  ightarrow eleven
$VP  o MD \ VP$	RB  ightarrow a.m.
$V\!P  ightarrow V\!BDADJ\!P$	VB  ightarrow arrive
$VP  o MD \ VP$	$VBD  ightarrow was \mid said$
$\mathit{VP}  ightarrow \mathit{VB} \mathit{PP} \mathit{NP}$	$MD \rightarrow should \mid would$
ADJP  ightarrow JJPP	
PP  ightarrow IN  NP	
PP  ightarrow IN  NP  RB	

Figure 6: CFG grammar rules and lexicon from the treebank sentences in the previous figure.

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- These rules include variations for different combinations of prepositional phrases (PP) and verb arguments.
- Examples of CFG Rules for VP Expansion:
- VP → VBD PP
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- VP → VBD PP PP PP
- VP → VBD PP PP PP
- VP → VB ADVP PP

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- Two grammars are **weakly equivalent** if they generate the same set of strings but do not necessarily assign the same phrase structure.
- Normal Form:
- Chomsky Normal Form (CNF): A context-free grammar is in CNF if each rule is of the form  $A \to BC$  (two non-terminals) or  $A \to a$  (a terminal), where A,B,C are non-terminals, and a is a terminal. It cannot have empty  $(\epsilon)$  productions.

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- Binary Branching: CNF ensures that every rule leads to binary branching, meaning that each rule breaks down into at most two components.
- $\bullet$  Conversion: Any context-free grammar can be converted into CNF. For example, a rule like  $A\to BCD$  can be split into two binary rules:
- $\bullet$   $A \rightarrow BX$
- $X \to CD$

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- $\bullet X \to CD$
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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 → Houston   NWA
$NP \rightarrow Det\ Nominal$	$Aux \rightarrow does$
$Nominal \rightarrow Noun$	$Preposition \rightarrow from \mid to \mid on \mid near \mid through$
$Nominal \rightarrow Nominal Noun$	
$Nominal \rightarrow Nominal PP$	
$VP \rightarrow Verb$	
$VP \rightarrow Verb NP$	
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$VP \rightarrow Verb PP$	
$VP \rightarrow VP PP$	
$PP \rightarrow Preposition NP$	

Figure 7: The  $\mathcal{L}_1$  miniature English grammar and lexicon.

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- Structural Ambiguity: Multiple valid parse trees for a sentence (e.g., *I saw the man with the telescope*).
- Lexical Ambiguity: A word can have multiple meanings (e.g., bank could refer to a financial institution or the side of a river).

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- Example: I saw the man with the telescope
- Ambiguous because "with the telescope" can modify either "saw" or "the man."
- Two possible parse trees:
- I [saw the man] [with the telescope] (I used the telescope to see the man).
- I saw [the man with the telescope] (The man I saw had a telescope).



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### Ambiguity:

I saw the man [with the telescope] vs. I saw [the man with the telescope]

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## **Introduction to Constituency Parsing**

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- Constituents behave as single units within a sentence, and parsing aims to identify these groupings.
- The most common constituents are noun phrases, verb phrases, and prepositional phrases.

# **Introduction to Constituency Parsing**

- Constituency Parsing is the process of analyzing the syntactic structure of a sentence by breaking it down into its constituent parts (phrases or subphrases).
- Constituents behave as single units within a sentence, and parsing aims to identify these groupings.
- The most common constituents are noun phrases, verb phrases, and prepositional phrases.
- Example: The cat sat on the mat.
- Noun Phrase (NP) = The cat, Verb Phrase (VP) = sat on the mat



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• Evidence for constituents can be found through tests such as substitution, movement, and coordination.

• Example: Harry the Horse arrived.

• The noun phrase *Harry the Horse* can be substituted with *he*, showing that it forms a constituent.

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# Introduction to CKY Parsing

- Cocke-Kasami-Younger (CKY) algorithm, the most widely used dynamic-programming based approach to parsing. is a dynamic programming algorithm used for parsing sentences using context-free grammars in Chomsky Normal Form (CNF).
- The algorithm efficiently handles parsing by systematically exploring all possible substructures of a sentence.
- CKY parsing is particularly useful for identifying all possible parse trees for a given sentence, which is crucial for handling ambiguity.

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# **Requirements for CKY Parsing**

- CKY Parsing requires the grammar to be in Chomsky Normal Form (CNF).
- Chomsky Normal Form: A rule in CNF is of the form  $A \to BC$  or  $A \to a$ , where:
- A, B, and C are non-terminals.
- a is a terminal (word).

• Conversion to CNF involves eliminating epsilon rules, unit productions, and ensuring all productions are binary branching.

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### Illustration

$\mathscr{L}_1$ Grammar	$\mathscr{L}_1$ in CNF
$S \rightarrow NP VP$	$S \rightarrow NPVP$
$S \rightarrow Aux NP VP$	$S \rightarrow XI VP$
	$XI \rightarrow Aux NP$
$S \rightarrow VP$	$S \rightarrow book \mid include \mid prefer$
	$S \rightarrow Verb NP$
	$S \rightarrow X2 PP$
	$S \rightarrow Verb PP$
	$S \rightarrow VPPP$
$NP \rightarrow Pronoun$	$NP \rightarrow I \mid she \mid me$
$NP \rightarrow Proper-Noun$	$NP \rightarrow TWA \mid Houston$
$NP \rightarrow Det Nominal$	$NP \rightarrow Det Nominal$
$Nominal \rightarrow Noun$	Nominal → book   flight   meal   money
$Nominal \rightarrow Nominal Noun$	$Nominal \rightarrow Nominal Noun$
$Nominal \rightarrow Nominal PP$	$Nominal \rightarrow Nominal PP$
$VP \rightarrow Verb$	$VP \rightarrow book \mid include \mid prefer$
$VP \rightarrow Verb NP$	$VP \rightarrow Verb NP$
$VP \rightarrow Verb NP PP$	$VP \rightarrow X2 PP$
	$X2 \rightarrow Verb NP$
$VP \rightarrow Verb PP$	$VP \rightarrow Verb PP$
$VP \rightarrow VP PP$	$VP \rightarrow VP PP$
$PP \rightarrow Preposition NP$	PP → Preposition NP

Figure 8:  $\mathcal{L}_1$  Grammar and its conversion to CNF.

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# **CKY Parsing Algorithm**

- The CKY algorithm fills a parse table by examining all possible substrings of the input sentence.
- For each substring, the algorithm checks all possible ways to split it into two parts and applies grammar rules to form constituents.
- The table is filled in a bottom-up manner, starting with the smallest substrings and working up to the full sentence.
- The presence of a start symbol (S) spanning the entire input in the parse table indicates that the sentence is grammatically correct.

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# **Example of CKY Parsing**

• **Sentence:** Book the flight through Houston.

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- **Sentence:** Book the flight through Houston.
- Parse table initialization: Start by filling cells corresponding to single words using lexical rules.
- Iteratively fill the table by combining entries based on binary rules from CNF:
- Example: If NP and VP are found, check rules that can combine them into larger constituents.

• The goal is to fill the top-right cell with the start symbol S.

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### **CKY Algorithm Workflow**

### Step-by-Step Process:

- Initialization: Fill the diagonal of the CKY table with parts of speech for each word in the sentence using lexical rules.
- Filling the Table:
  - For each cell, consider all possible ways to split the substring into two parts.
  - Check grammar rules for combining the two parts and add any valid constituents to the cell.
- Final Step: If the top-right cell contains the start symbol 'S', the sentence is valid.

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#### **Key Advantages of CKY Parsing:**

- Handles ambiguous sentences by finding all possible parses.
- Efficient dynamic programming approach.
- Suitable for sentences parsed using CNF grammars.



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# **CKY Parsing Algorithm (Illustration)**

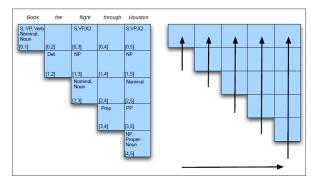
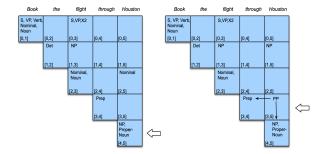


Figure 9: Completed parse table for Book the flight through Houston.

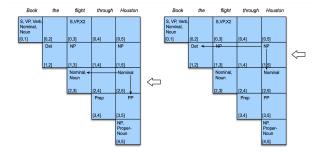
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### **CKY** in Practice

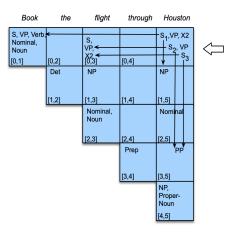


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### **CKY** in Practice



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- Ambiguity Handling: CKY can handle multiple parse trees by maintaining all possible constituents in the parse table.
- Limitations: Requires conversion to CNF, which can lead to an increase in grammar size and complexity.
- Applications: Used in natural language processing tasks like syntax checking, language understanding, and as a foundation for more advanced parsing algorithms.

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- **CKY Parsing** is an efficient algorithm for parsing sentences using a grammar in Chomsky Normal Form (CNF).
- **Treebanks** provide syntactic annotations for sentences, allowing extraction of rules and aiding in parsing tasks.