

Dynamic Programming Parsing

Dynamic Programming Parsing

- To avoid extensive repeated work, must cache intermediate results, i.e., completed phrases.
- Dynamic programming algorithms based on both top-down and bottom-up search can achieve $O(n^3)$ recognition time where n is the length of the input string.

Dynamic Programming Parsing Methods

1. CKY (Cocke-Kasami-Younger) algorithm: bottom-up, requires normalizing the grammar
2. Chart Parsers - retain completed phrases in a chart and can combine top-down and bottom-up searches.
3. Earley Parser - top-down, does not require normalizing grammar, more complex

The CYK Algorithm

CYK Algorithm

- The **Cocke–Younger–Kasami algorithm** (alternatively called **CYK**, or **CKY**) is a parsing algorithm for context-free grammars, named after its inventors, John Cocke, Daniel Younger and Tadao Kasami.
- It employs bottom-up parsing and dynamic programming
- It determines if a sentence is in the language generated by grammar.

The CYK Algorithm

– Problem:

- Given a context-free grammar **G** and a string **w**
 - **G** = (V, Σ, P, S) where
 - V finite set of variables
 - Σ (the alphabet) finite set of terminal symbols
 - P finite set of rules
 - S start symbol (distinguished element of V)
 - V and Σ are assumed to be disjoint
 - **G** is used to generate the string of a language

– Question:

- Is **w** in **L(G)**?

CYK Algorithm Basics

- The Structure of the rules in a Chomsky Normal Form grammar
- Uses a “dynamic programming” or “table-filling algorithm”

Chomsky Normal Form

- *Normal Form* is described by a set of conditions that each rule in the grammar must satisfy
- Context-free grammar is in CNF if each rule has one of the following forms:

$A \rightarrow BC$ at most 2 symbols on right

$A \rightarrow a$, or side terminal symbol

$S \rightarrow \epsilon$ null string

where $B, C \in V - \{S\}$

Converting to CNF

Original Grammar

$S \rightarrow NP VP$

$S \rightarrow Aux NP VP$

$S \rightarrow VP$

$NP \rightarrow Pronoun$

$NP \rightarrow Proper-Noun$

$NP \rightarrow Det Nominal$

$Nominal \rightarrow Noun$

$Nominal \rightarrow Nominal Noun$

$Nominal \rightarrow Nominal PP$

$VP \rightarrow Verb$

$VP \rightarrow Verb NP$

$VP \rightarrow VP PP$

$PP \rightarrow Prep NP$

$Pronoun \rightarrow I \mid he \mid she \mid me$

$Noun \rightarrow book \mid flight \mid meal \mid money$

$Verb \rightarrow book \mid include \mid prefer$

$Proper-Noun \rightarrow Houston \mid NWA$

$Aux \rightarrow is, am$

$PP \rightarrow on, in, over$

Converting to CNF

Original Grammar

S → **NP VP**
S → **Aux NP VP**
S → **VP**
NP → **Pronoun**
NP → **Proper-Noun**
NP → **Det Nominal**
Nominal → **Noun**
Nominal → **Nominal Noun**
Nominal → **Nominal PP**
VP → **Verb**
VP → **Verb NP**
VP → **VP PP**
PP → **Prep NP**
Pronoun → **I | he | she | me**
Noun → **book | flight | meal | money**
Verb → **book | include | prefer**
Proper-Noun → **Houston | NWA**
Aux → **is, am**
PP → **on, in, over**

Chomsky Normal Form

S → **NP VP**
S → **X1 VP**
X1 → **Aux NP**
S → **book | include | prefer**
S → **Verb NP**
S → **VP PP**
NP → **I | he | she | me**
NP → **Houston | NWA**
NP → **Det Nominal**
Nominal → **book | flight | meal | money**
Nominal → **Nominal Noun**
Nominal → **Nominal PP**
VP → **book | include | prefer**
VP → **Verb NP**
VP → **VP PP**
PP → **Prep NP**
Noun → **book | flight | meal | money**
Verb → **book | include | prefer**
Aux → **is, am**
PP → **on, in, over**

CYK Algorithm

Construct a Triangular Table

- Each row corresponds to some length of substrings

Construct a Triangular Table

0	w_1	1	w_2	2	w_3	3	w_4	4	w_5	5
	$x_{0,1}$		$x_{0,2}$		$x_{0,3}$		$x_{0,4}$		$x_{0,5}$	
		$x_{1,2}$		$x_{1,3}$		$x_{1,4}$		$x_{1,5}$		
				$x_{2,3}$		$x_{2,4}$		$x_{2,5}$		
						$x_{3,4}$		$x_{3,5}$		
								$x_{4,5}$		

Table for string ' w ' that has length 5

Example CYK Algorithm

- Show that the sentence $s \in L(G)$ [where $s = \text{"a pilot likes flying planes"}$, using CYK Algorithm with the following G :

Grammar G

$S \rightarrow NP VP$

$VP \rightarrow VBG NNS$

$VP \rightarrow VBZ VP$

$VP \rightarrow VBZ NP$

$NP \rightarrow DT NN$

$NP \rightarrow JJ NNS$

$VBZ \rightarrow \text{likes}$

$VBG \rightarrow \text{flying}$

$DT \rightarrow \text{a}$

$NN \rightarrow \text{pilot}$

$JJ \rightarrow \text{flying}$

$NNS \rightarrow \text{planes}$

Construct a Triangular Table

0	a	1	pilot	2	likes	3	flying	4	planes	5
	$x_{0,1}$		$x_{0,2}$		$x_{0,3}$		$x_{0,4}$		$x_{0,5}$	
		$x_{1,2}$		$x_{1,3}$		$x_{1,4}$		$x_{1,5}$		
				$x_{2,3}$		$x_{2,4}$		$x_{2,5}$		
						$x_{3,4}$		$x_{3,5}$		
								$x_{4,5}$		

Table for sentence that has length 5

Construct a Triangular Table

0	a	1	pilot	2	likes	3	flying	4	planes	5
	DT $x_{0,1}$		$x_{0,2}$		$x_{0,3}$		$x_{0,4}$		$x_{0,5}$	
		NN $x_{1,2}$		$x_{1,3}$		$x_{1,4}$		$x_{1,5}$		
				VBZ $x_{2,3}$		$x_{2,4}$		$x_{2,5}$		
						VBG, JJ $x_{3,4}$		$x_{3,5}$		
								NNS $x_{4,5}$		

$x_{0,1}$ = DT -> a
 $x_{1,2}$ = NN -> pilot
 $x_{2,3}$ = VBZ -> likes
 $x_{3,4}$ = VBG -> flying, JJ -> flying
 $x_{4,5}$ = NNS -> planes

Construct a Triangular Table

0	a	1	pilot	2	likes	3	flying	4	planes	5
	DT $x_{0,1}$		NP $x_{0,2}$		$x_{0,3}$		$x_{0,4}$		$x_{0,5}$	
		NN $x_{1,2}$		-- $x_{1,3}$		$x_{1,4}$		$x_{1,5}$		
			VBZ $x_{2,3}$		-- $x_{2,4}$		$x_{2,5}$			
						VBG, JJ $x_{3,4}$		VP, NP $x_{3,5}$		
								NNS $x_{4,5}$		

$x_{0,2} = x_{0,1} \quad x_{1,2}$
 $= \text{DT NN} = \text{NP}$

$x_{1,3} = x_{1,2} \quad x_{2,3}$
 $= \text{NN VBZ},$
 $\text{NN JJ} = \varphi$

0	a	1	pilot	2	likes	3	flying	4	planes	5
	DT $x_{0,1}$	NP $x_{0,2}$	-- $x_{0,3}$				$x_{0,4}$	$x_{0,5}$		
		NN $x_{1,2}$	-- $x_{1,3}$				-- $x_{1,4}$	$x_{1,5}$		
					VBZ $x_{2,3}$		-- $x_{2,4}$	VP1=VBZ VP VP2=VBZ NP $x_{2,5}$		
							VBG, JJ $x_{3,4}$	VP, NP $x_{3,5}$		
									NNS $x_{4,5}$	

$$x_{0,3} = x_{0,1} x_{1,3}, x_{0,2} x_{2,3}$$

$$= \text{DT--}, \quad \text{NP VBZ}$$

$$= \varphi$$

$$x_{1,4} = x_{1,2} x_{2,4}, x_{1,3} x_{3,4}$$

$$= \text{NN --, --VBG, --JJ}$$

$$= \varphi$$

$$x_{2,5} = x_{2,3} x_{3,5}, x_{2,4} x_{4,5}$$

$$= \text{VBZ VP, VBZ NP, -- NNS}$$

$$= \text{VP1, VP2}$$

0	a	1	pilot	2	likes	3	flying	4	planes	5
DT $x_{0,1}$		NP $x_{0,2}$		-- $x_{0,3}$	-- $x_{0,4}$	$x_{0,5}$				
		NN $x_{1,2}$		-- $x_{1,3}$	-- $x_{1,4}$	$x_{1,5}$				
$x_{0,4} = x_{0,1}x_{1,4}, x_{0,2}x_{2,4},$ $x_{0,3}x_{3,4} = \text{DT--}, \text{NP--}, \text{-- VBG},$ -- JJ = φ				VBZ $x_{2,3}$	-- $x_{2,4}$	VP1=VBZ VP VP2=VBZ NP $x_{2,5}$				
$x_{1,5} = x_{1,2}x_{2,5}, x_{1,3}x_{3,5}, x_{1,4}$ $x_{4,5} = \text{NN VP1}, \text{NN VP2}, \text{-- VP},$ --NP, --NNS= φ					VBG, JJ $x_{3,4}$		VP, NP $x_{3,5}$			
						NNS $x_{4,5}$				

0	a	1	pilot	2	likes	3	flying	4	planes	5
	DT $x_{0,1}$		NP $x_{0,2}$		-- $x_{0,3}$		-- $x_{0,4}$		S=NP VP1 S=NP VP2 $x_{0,5}$	
			NN $x_{1,2}$		-- $x_{1,3}$		-- $x_{1,4}$		-- $x_{1,5}$	
$x_{0,5} = x_{0,1} x_{1,5}, x_{0,2} x_{2,5},$ $x_{0,3} x_{3,5}, x_{0,4} x_{4,5}$ =DT --,NP VP1,NP VP2, -- VP/NP, -- NNS = S_1, S_2					VBZ $x_{2,3}$		-- $x_{2,4}$		VP1=VBZ VP VP2=VBZ NP $x_{2,5}$	
							VBG, JJ $x_{3,4}$		VP, NP $x_{3,5}$	
									NNS $x_{4,5}$	

Theorem

- The CYK Algorithm correctly computes X_{ij} for all i and j ; thus sentence S is in $L(G)$ if and only if S is in X_{0n} .
- The running time of the algorithm is $O(n^3)$.

Question

Analyze the following sentence using CYK algorithm.

Does the sentence belongs to the $L(G)$?

Astronomers saw stars with telescope

Grammar(G):

$S \rightarrow NP VP$

$NP \rightarrow \text{saw}$

$VP \rightarrow VP PP$

$V \rightarrow \text{saw}$

$VP \rightarrow V NP$

$P \rightarrow \text{with}$

$NP \rightarrow NP PP$

$NP \rightarrow \text{astronomers}$

$PP \rightarrow P NP$

$NP \rightarrow \text{stars}$

$NP \rightarrow \text{telescope}$

Question

- Show the CYK Algorithm with the following example:
 - CNF grammar **G**
 - $S \rightarrow AB \mid BC$
 - $A \rightarrow BA \mid a$
 - $B \rightarrow CC \mid b$
 - $C \rightarrow AB \mid a$
 - **w** is ababa
 - Question Is **ababa** in $L(G)$?
- Basics of CYK Algorithm
 - The Structure of the rules in a Chomsky Normal Form grammar
 - Uses a “dynamic programming” or “table-filling algorithm”
- Complexity $O(n^3)$