Parsing: Introduction

Context-free Grammars

- Chomsky hierarchy
 - Type 0 Grammars/Languages
 - rewrite rules $\alpha \rightarrow \beta$; α,β are any string of terminals and nonterminals
 - Context-sensitive Grammars/Languages
 - rewrite rules: $\alpha X\beta \rightarrow \alpha \gamma \beta$, where X is nonterminal, α, β, γ any string of terminals and nonterminals (γ must not be empty)

- <u>Context-free Grammars/Lanuages</u>

- rewrite rules: $X \rightarrow \gamma$, where X is nonterminal, γ any string of terminals and nonterminals
- Regular Grammars/Languages
 - rewrite rules: $X \rightarrow \alpha Y$ where X,Y are nonterminals, α string of terminal symbols; Y might be missing

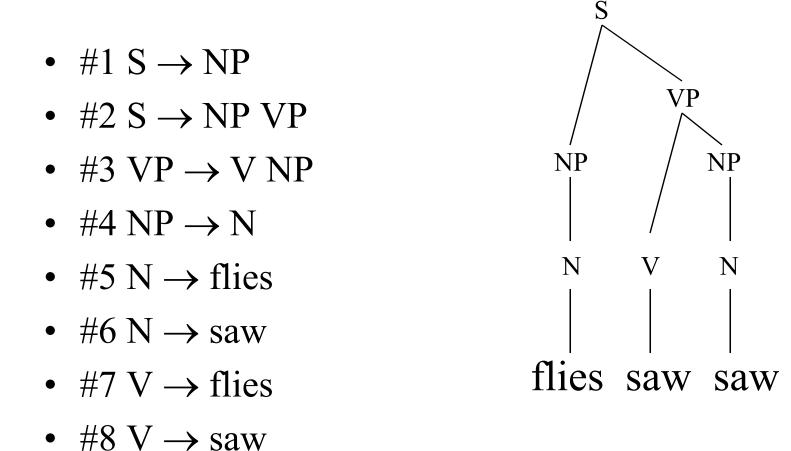
Parsing Regular Grammars

- Finite state automata
 - Grammar ↔ regular expression ↔ finite state automaton
- Space needed:
 - constant
- Time needed to parse:
 - linear (~ length of input string)
- Cannot do e.g. aⁿbⁿ, embedded recursion (context-free grammars can)

Parsing Context Free Grammars

- Widely used for surface syntax description (or better to say, for correct word-order specification) of natural languages
- Space needed:
 - stack (sometimes stack of stacks)
 - in general: items ~ levels of actual (i.e. in data) recursions
- Time: in general, $O(n^3)$
- Cannot do: e.g. aⁿbⁿcⁿ (Context-sensitive grammars can)

Example Toy NL Grammar



Shift-Reduce Parsing in Detail

Grammar Requirements

- Context Free Grammar with
 - no empty rules (N $\rightarrow \epsilon$)
 - can always be made from a general CFG, except there might remain one rule $S \rightarrow \epsilon$ (easy to handle separately)
 - recursion OK
- Idea:
 - go bottom-up (otherwise: problems with recursion)
 - construct a Push-down Automaton (non-deterministic in general, PNA)

delay rule acceptance until all of a (possible) rule parsed
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PNA Construction -Elementary Procedures

- Initialize-Rule-In-State(q,A $\rightarrow \alpha$) procedure:
 - Add the rule $(A \rightarrow \alpha)$ into a state q.
 - Insert a dot in front of the R[ight]H[and]S[ide]: A \rightarrow . α
- Initialize-Nonterminal-In-State(q,A) procedure:
 - Do "Initialize-Rule-In-State(q,A $\rightarrow \alpha$)" for all rules having the nonterminal A on the L[eft]H[and]S[ide]
- Move-Dot-In-Rule($q, A \rightarrow \alpha \cdot Z\beta$) procedure:
 - Create a new rule in state q: $A \rightarrow \alpha Z$. β , Z term. or not

PNA Construction

- Put 0 into the (FIFO/LIFO) list of incomplete states, and do Initialize-Nonterminal-In-State(0,S)
- Until the list of incomplete states is not empty, do:
 - 1. Get one state, i from the list of incomplete states.
 - 2. Expand the state:
 - Do recursively Initialize-Nonterminal-In-State(i,A) for all nonterminals A right <u>after</u> the dot in any of the rules in state i.
 - 3. If the state matches exactly some other state already in the list of complete states, renumber all shift-references to it to the old state and discard the current state.

PNA Construction (Cont.)

- 4. Create a set T of Shift-References (or, transition/continuation links) for the current state i {(Z,x)}:
 - Suppose the highest number of a state in the incomplete state list is n.
 - For each symbol Z (regardless if terminal or nonterminal) which appears after the dot in any rule in the current state q, do:
 - increase n to n+1
 - add (Z,n) to T
 - *NB: each symbol gets only one Shift-Reference, regardless of how many times (i.e. in how many rules) it appears to the right of a dot.*
 - Add n to the list of incomplete states
 - Do Move-Dot-In-Rule($n, A \rightarrow \alpha . Z\beta$)
- 5. Create Reduce-References for each rule in the current state i:
 - For each rule of the form $(A \rightarrow \alpha .)$ (i.e. dot at the end) in the current state, attach to it the rule number <u>r</u> of the rule $A \rightarrow \alpha$ from the grammar.

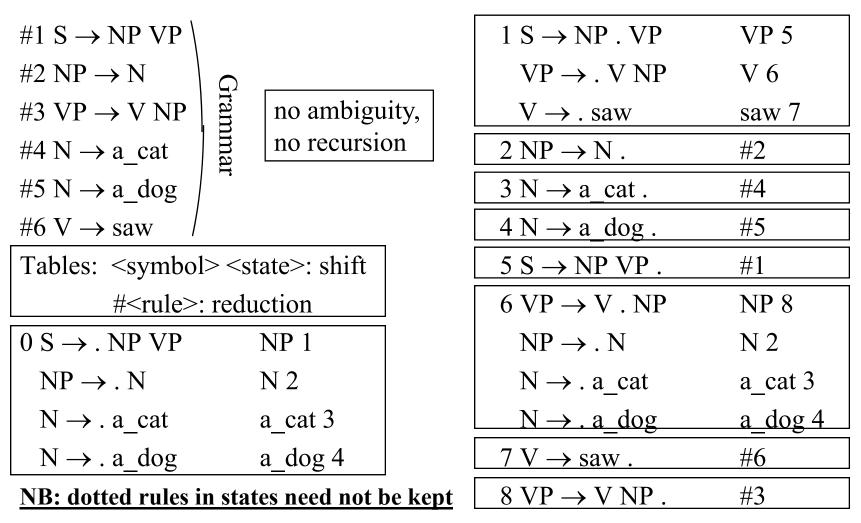
Using the PNA (Initialize)

- Maintain two stacks, the <u>input</u> stack I and the <u>state</u> stack Q.
- Maintain a stack B[acktracking] of the two stacks.
- Initialize the I stack to the input string (of terminal symbols), so that the first symbol is on top of it.
- Initialize the stack Q to contain state 0.
- Initialize the stack B to empty.

Using the PNA (Parse)

- Do until you are not stuck and/or B is empty:
 - Take the top of stack Q state ("current" state \underline{i}).
 - Put all possible reductions in state <u>i</u> on stack B, including the contents of the current stacks I and Q.
 - Get the symbol from the top of the stack I (symbol Z).
 - If (Z,x) exists in the set T associated with the current state
 <u>i</u>, push state x onto the stack Q and remove Z from I.
 Continue from beginning.
 - Else pop the first possibility from B, remove <u>n</u> symbols from the stack Q, and push A to I, where $A \rightarrow Z_1...Z_n$ is the rule according which you are reducing.

Small Example



Small Example: Parsing(1)

• To parse: a dog saw a cat

Input stack (top on the left) Rule State stack (top on the left) Comment(s)

٠	a_dog saw a_cat		0	
•	saw a_cat		4 0	shift to 4 over a_dog
٠	N saw a_cat	#5	0	reduce #5: N \rightarrow a_dog
•	saw a_cat		2 0	shift to 2 over N
٠	NP saw a_cat	#2	0	reduce #2: NP \rightarrow N
٠	saw a_cat		10	shift to 1 over NP
٠	a_cat		710	shift to 7 over saw
٠	V a_cat	#6	1 0	reduce #6: $V \rightarrow saw$

Small Example: Parsing (2)

• ...still parsing: a_dog saw a_cat

٠	[V a_cat	#6	1 0] \leftarrow Previous parser configuration					
•	a_cat		610	shift to 6 over V				
٠			3610	empty input stack (not finished though!)				
•	Ν	#4	610	N inserted back				
•			2610	again empty input stack				
٠	NP	#2	610					
•			8610	and again				
٠	VP	#3	10	two states removed (RHS(#3) =2)				
٠			510					
٠	S	#1	0	again, two items removed (RHS: NP VP)				
Sı	Success: S/0 alone in input/state stack; reverse right derivation: 1,3,2,4,6,2,5							
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Big Example: Ambiguous and Recursive Grammar

- #1 S \rightarrow NP VP
- $#2 \text{ NP} \rightarrow \text{NP REL VP}$
- $#3 \text{ NP} \rightarrow \text{N}$
- #4 NP \rightarrow N PP
- $#5 \text{ VP} \rightarrow \text{V NP}$
- $#6 \text{ VP} \rightarrow \text{V} \text{ NP} \text{ PP}$
- $\#7 \text{ VP} \rightarrow \text{VPP}$
- $#8 PP \rightarrow PREP NP$

- $#9 \text{ N} \rightarrow a_\text{cat}$
- $\#10 \text{ N} \rightarrow a_dog$
- #11 N \rightarrow a_hat
- #12 PREP \rightarrow in
- #13 REL \rightarrow that
- #14 V \rightarrow saw
- #15 V \rightarrow heard

Big Example: Tables (1)

$0 \text{ S} \rightarrow . \text{NP VP}$	NP	1	$2 \text{ NP} \rightarrow \text{N}$.	#3	
$NP \rightarrow . NP REL VP$			$NP \rightarrow N \cdot PP$	PP	12
$NP \rightarrow . N$	Ν	2	$PP \rightarrow . PREP NP$	PREP	13
$NP \rightarrow . N PP$			$PREP \to . \text{ in }$	in	14
$N \rightarrow . a_{cat}$	a_cat	3			
$N \rightarrow . a_dog$	a_dog	4	$3 \text{ N} \rightarrow a_\text{cat}$.	#9	
$N \rightarrow . a_{mirror}$	a_hat	5			
			$4 \text{ N} \rightarrow a_{dog}$.	#10	
$1 \text{ S} \rightarrow \text{NP}$. VP	VP	6			
$NP \rightarrow NP$. REL VP	REL	7	$5 \text{ N} \rightarrow a \text{_hat}$.	#11	
$VP \rightarrow . V NP$	V	8			
$VP \rightarrow . V NP PP$			$6 \text{ S} \rightarrow \text{NP VP}$.	#1	
$VP \rightarrow . V PP$					
$REL \rightarrow .$ that	that	9			
$V \rightarrow .$ saw	saw	10			
$V \rightarrow .$ heard	heard	11			

Big Example: Tables (2)

$7 \text{ NP} \rightarrow \text{NP REL} \cdot \text{VP}$	VP	15	9 REL \rightarrow that .	#13	
$VP \rightarrow . V NP$	V	8			
$VP \rightarrow . V NP PP$			$10 \text{ V} \rightarrow \text{saw}$.	#14	
$VP \rightarrow . V PP$					
$V \rightarrow .$ saw	saw	10	11 V \rightarrow heard.	#15	
$V \rightarrow .$ heard	heard	11			
			$12 \text{ NP} \rightarrow \text{NP PP}$.	#4	
$8 \text{ VP} \rightarrow \text{V} \cdot \text{NP}$	NP	16			
$VP \rightarrow V . NP PP$			$13 \text{ PP} \rightarrow \text{PREP}$. NP	NP	18
$VP \rightarrow V \cdot PP$	PP	17	$NP \rightarrow . NP REL VP$		
$NP \rightarrow . NP REL VP$			$NP \rightarrow . N$	Ν	2
$NP \rightarrow . N$	Ν	2	$NP \rightarrow . N PP$		
$NP \rightarrow . N PP$			$N \rightarrow . a_cat$	a_cat	3
$N \rightarrow . a_cat$	a_cat	3	$N \rightarrow . a_dog$	a_dog	4
$N \rightarrow . a_dog$	a_dog	4	$N \rightarrow . a_{hat}$	a_hat	5
$N \rightarrow . a_{hat}$	a_hat	5			
$PP \rightarrow . PREP NP$	PREP	13			
$PREP \to . \text{ in }$	in	14			

Big Example: Tables (3)

14 PREP \rightarrow in .	#12		$19 \text{ VP} \rightarrow \text{V NP PP} . \qquad \#6$
$15 \text{ NP} \rightarrow \text{NP REL VP}$.	#2		Comments:
16 VP \rightarrow V NP . VP \rightarrow V NP . PP NP \rightarrow NP . REL VP PP \rightarrow . PREP NP PREP \rightarrow . in REL \rightarrow . that	#5 PP REL PREP in that	19 7 13 14 9	 states 2, 16, 18 have shift-reduce conflict no states with reduce-reduce conflict also, again there is no need to store the dotted rules in the states for
$17 \text{ VP} \rightarrow \text{V PP}$.	#7		parsing. Simply store the pair input/goto-state, or the rule numbe
$18 \text{ PP} \rightarrow \text{PREP NP} .$ NP \rightarrow NP . REL VP REL \rightarrow . that	#8 REL that 9	7	

Big Example: Parsing (1)

 To parse: a_dog heard a_cat in a_hat 					
Input stack (top on the left)	State stack (top on th	State stack (top on the left)			
Ru	ule Backtrack	Comment(s)			
 a_dog heard a_cat in a_hat 	0	shifted to 4 over a_dog			
• heard a_cat in a_hat	4 0	shift to 4 over a_dog			
• N heard a_cat in a_hat #1	10 0	reduce #10: N \rightarrow a_dog			
 heard a_cat in a_hat 	20	shift to 2 over N ¹			
• NP heard a_cat in a_hat #3	3 0	reduce #3: NP \rightarrow N			
 heard a_cat in a_hat 	1 0	shift to 1 over NP			
 a_cat in a_hat 	11 1 0	shift to 11 over heard			
• V a_cat in a_hat #1	15 10	reduce #15: V \rightarrow heard			
• a_cat in a_hat	810	shift to 8 over V			

¹see also next slide, last comment

Big Example: Parsing (2)

• ...still parsing: a_dog heard a_cat in a_hat

	Input stack (top on the left)		State stack (top on the left)		
		Rule	Backtrack	Comment(s)	
•	[a_cat in a_hat		$8 \ 1 \ 0$] \leftarrow [previous particular equation (1.1)	arser configuration]	
•	in a_hat		3810	shift to 3 over a_cat	
•	N in a_hat	#9	810	reduce #9: N \rightarrow a_cat	
•	in a_hat		$2 8 1 0 \otimes$	shift to 2 over N; see	
				why we need the state	
				stack? we are in 2 again,	
				but after we return, we	

will be in 8 not 0;

also save for backtrack¹!

¹the whole input stack, state stack, and [reversed] list of rules used for reductions so far must be saved on the backtrack stack

Big Example: Parsing (3)

• ...still parsing: a_dog heard a_cat in a_hat

	Input stack (top on the left)		State stack (top on the left)		
		Rule	Backtrack	Comment(s)	
٠	[in a_hat		$2 8 1 0 \otimes] \leftarrow [\text{previous}]$	ous parser configuration]	
•	a_hat		142810	shift to 14 over in	
•	PREP a_hat	#12	2810	reduce #12: PREP \rightarrow in ¹	
•	a_hat		13 2 8 1 0	shift to 13 over PREP	
•			5 13 2 8 1 0	shift to 5 over a_hat	
•	Ν	#11	13 2 8 1 0	reduce #11: N \rightarrow a_hat	
•			2 13 2 8 1 0	shift to 2 over N	
•	NP	#3	13 2 8 1 0	shift not possible; reduce	
				#3: NP \rightarrow N ^{1 on s.19}	
•			18 13 2 8 1 0	shift to 18 over NP	
4					

¹when coming back to an ambiguous state [here: state 2] (after some reduction), reduction(s) are not considered; nothing put on backtrk stack 2018/2019 UFAL MFF UK NPFL068/Intro to statistical NLP II/Jan Hajic and Pavel Pecina 95

Big Example: Parsing (4)

• ...still parsing: a_dog heard a_cat in a_hat

	Input stack (top on the left)		State stack (top on the left)		
		Rule	Backtrack	Comment(s)	
•	[$18\ 13\ 2\ 8\ 1\ 0] \leftarrow [procession 18\ 13\ 2\ 8\ 1\ 0]$	evious parser config.]	
•	PP	#8	2810	shift not possible;	
				reduce $#8^{1 \text{ on s. 19}}$:	
				$PP \rightarrow PREP NP^{1, prev.slide}$	
٠			122810	shift to 12 over PP	
٠	NP	#4	810	reduce #4: NP \rightarrow N PP	
•			16810	shift to 16 over NP	
•	VP	#5	1 0	shift not possible,	
				reduce $#5^1: VP \rightarrow V NP$	

¹no need to keep the item on the backtrack stack; no shift possible now and there is only one reduction (#5) in state 16

Big Example: Parsing (5)

• ...still parsing: a_dog heard a_cat in a_hat

	Input stack (top on the left)		State stack (top on the left)		
		Rule	Backtrack	Comment(s)	
•	[VP	#5	$1 0] \leftarrow [\text{previous par}]$	ser configuration]	
•			610	shift to 6 over VP	
•	S	#1	0	reduce #1: S \rightarrow NP VP	
				first solution found:	
				1,5,4,8,3,11,12,9,15,3,10	
				backtrack to previous \otimes :	
•	in a_hat		2810	was: shift over in, now ¹ :	
•	NP in a_hat	#3	8 1 0	reduce #3: NP \rightarrow N	
•	in a_hat		$16 \ 8 \ 1 \ 0 \otimes$	shift to 16 over NP	
•	a_hat		14 16 8 1 0	shift, but put on backtrk	

¹no need to keep the item on the backtrack stack; no shift possible now and there is only one reduction (#3) in state 2 2018/2019 UFAL MFF UK NPFL068/Intro to statistical NLP II/Jan Hajic and Pavel Pecina 97

Big Example: Parsing (6)

• ...still parsing: a_dog heard a_cat in a_hat

	Input stack (top on the left)		State stack (top on the left)		
		Rule	Backtrack	Comment(s)	
•	[a_hat		$14\ 16\ 8\ 1\ 0 \otimes] \leftarrow [pr$	revious parser config.]	
•	PREP a_hat	#12	16810	reduce #12: PREP \rightarrow in	
٠	a_hat		13 16 8 1 0	shift over PREP ^{1 on s.17}	
٠			5 13 16 8 1 0	shift over a_hat to 5	
•	Ν	#11	13 16 8 1 0	reduce #11: N \rightarrow a_hat	
٠			2 13 16 1 0	shift to 2 over N	
•	NP	#3	13 16 1 0	shift not possible ^{1 on s.19}	
•			18 13 16 1 0	shift to 18	
•	PP	#8	16 1 0	shift not possible ¹ , red.#8	
•			19 16 1 0	shift to 19 ^{1 on s.17}	

¹no need to keep the item on the backtrack stack; no shift possible now and there is only one reduction (#8) in state 18 2018/2019 UFAL MFF UK NPFL068/Intro to statistical NLP II/Jan Hajic and Pavel Pecina 98

Big Example: Parsing (7)

• ...still parsing: a_dog heard a_cat in a_hat

	Input stack (top on the left)		State stack (top on the left)	
		Rule	Backtrack	Comment(s)
•	[19 16 8 1 0] ← [pi	revious parser config.]
•	VP	#6	1 0	red. #6: VP \rightarrow V NP PP
•			610	shift to 6 over VP
•	S	#1	0	next (2 nd) solution:
				1,6,8,3,11,12,3, ¹ 9,15,3,10
				backtrack to previous \otimes :
•	in a_hat		16810	was: shift over in ^{1 on s.19} ,
•	VP in a_hat	#5	1 0	now red. #5: $VP \rightarrow V NP$
•	in a_hat		610	shift to 6 over VP
•	S in a_hat	#1	0	error ² ; backtrack empty: <u>stop</u>
	ntinue list of rules at the orig, backtrack mar	k (s.16.1ine 3	2 S (the start symbol) not all	lone in input stack when state stack $= (0)$

¹continue list of rules at the orig. backtrack mark (s.16,line 3) ²S (the start symbol) not alone in input stack when state stack = (0) 2018/2019 UFAL MFF UK NPFL068/Intro to statistical NLP II/Jan Hajic and Pavel Pecina 99