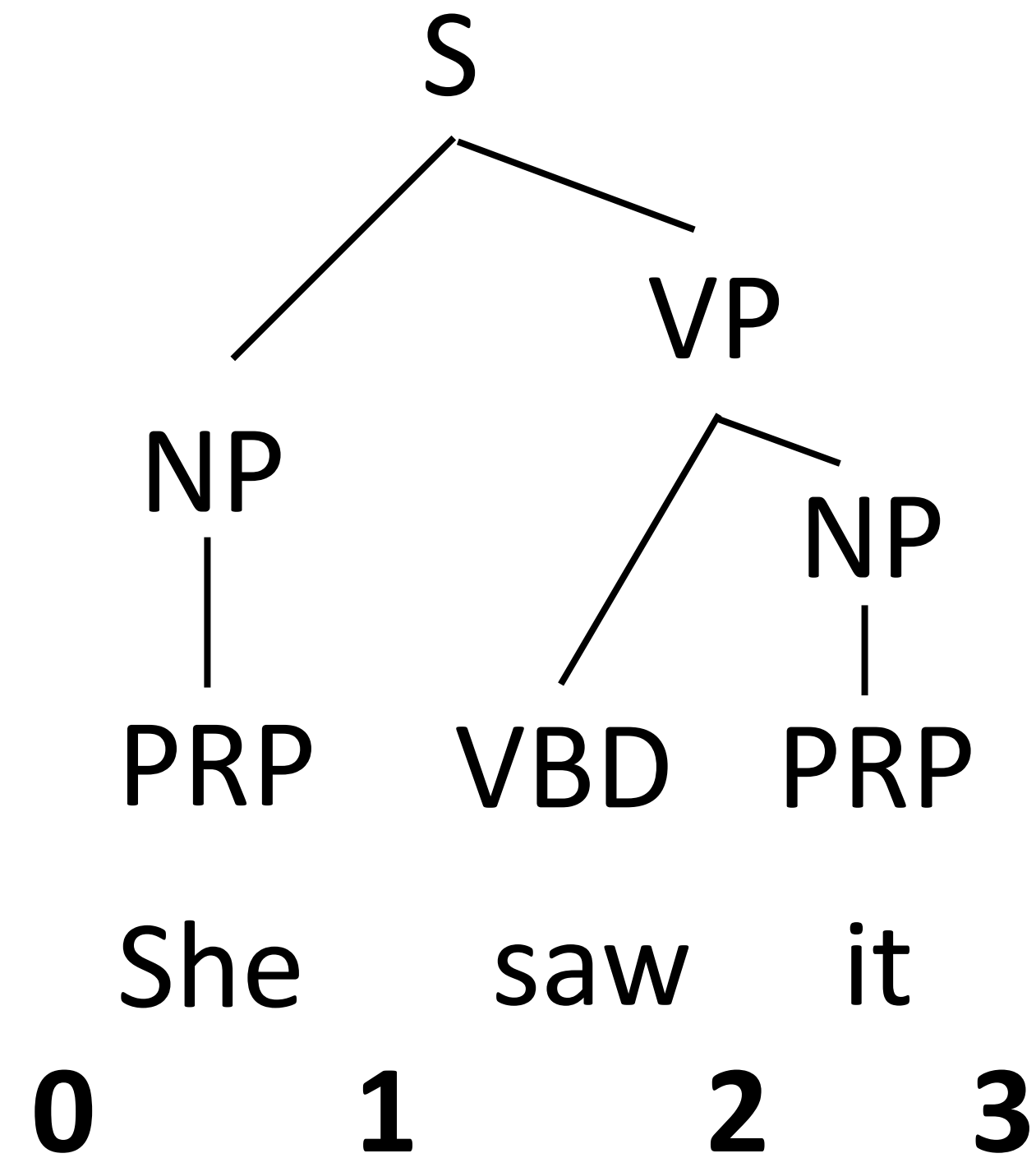


# Parser Evaluation

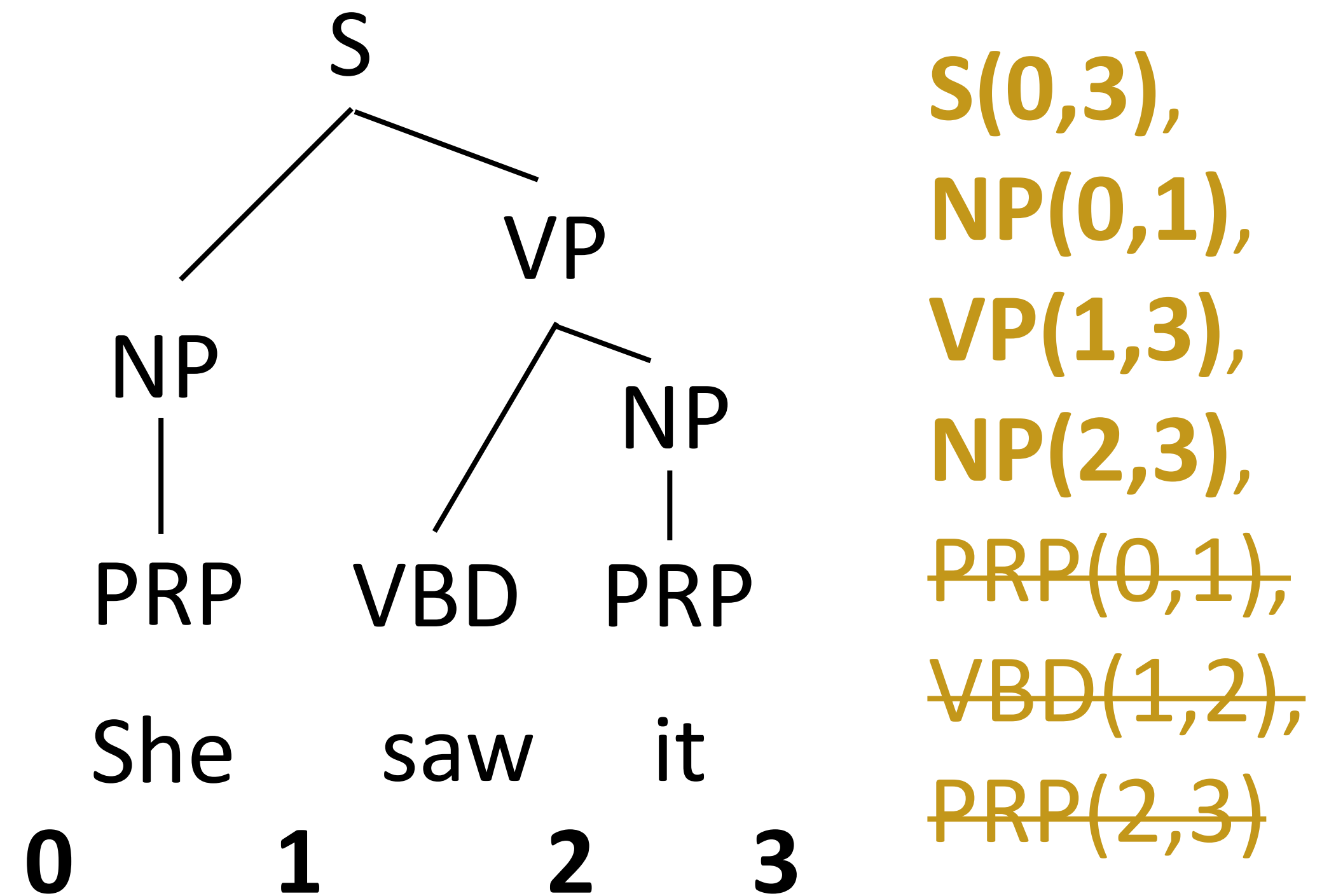
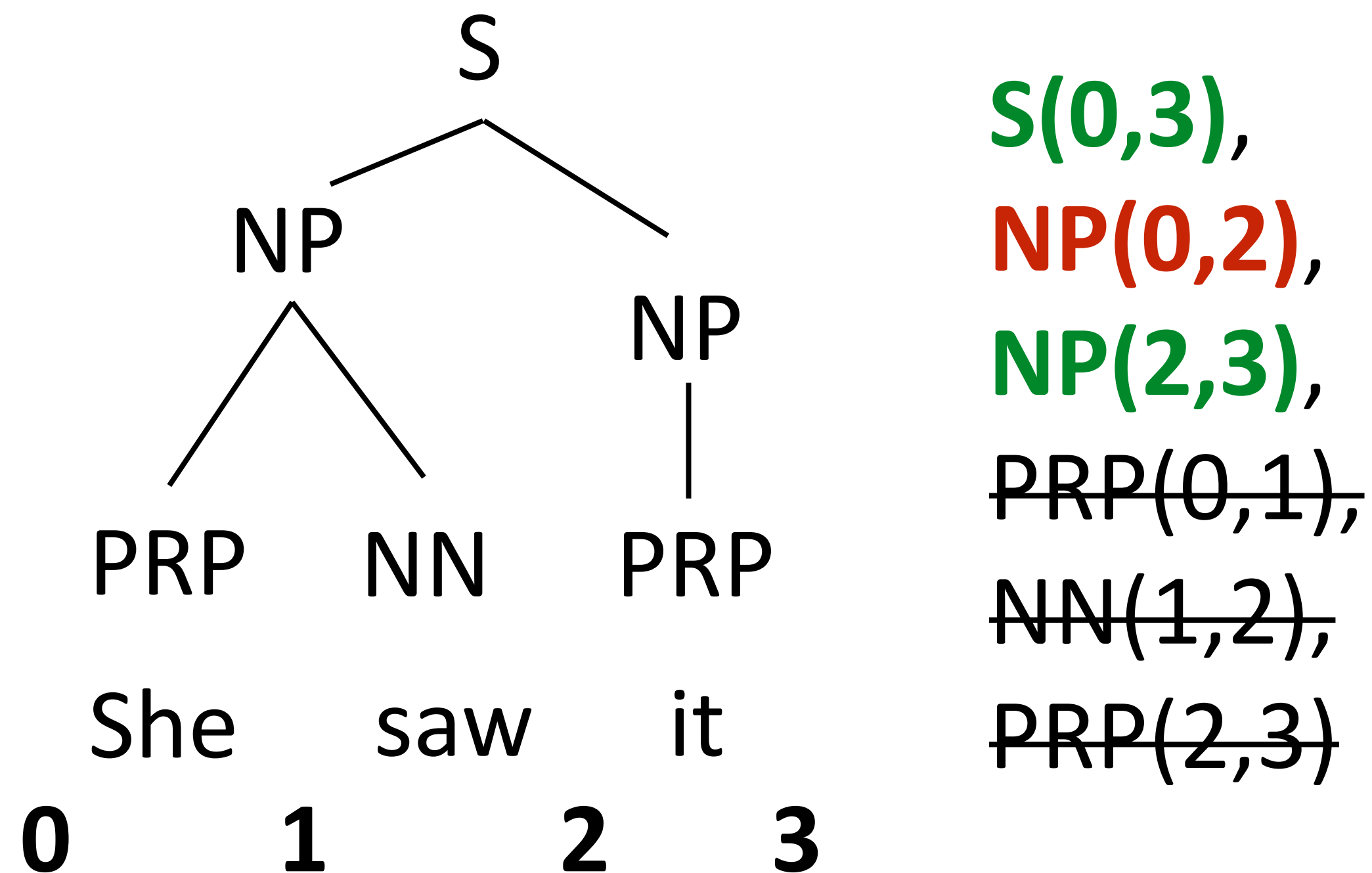


- VP(1,3), VBD(1,2), NP(2,3), PRP(2,3)





# Parser Evaluation



- ▶ Precision: number of correct predictions / number of predictions =  $2/3$
- ▶ Recall: number of correct predictions / number of golds =  $2/4$
- ▶ F1: harmonic mean of precision and recall =  $(1/2 * ((2/4)^{-1} + (2/3)^{-1}))^{-1}$   
= 0.57 (closer to min)



# Results

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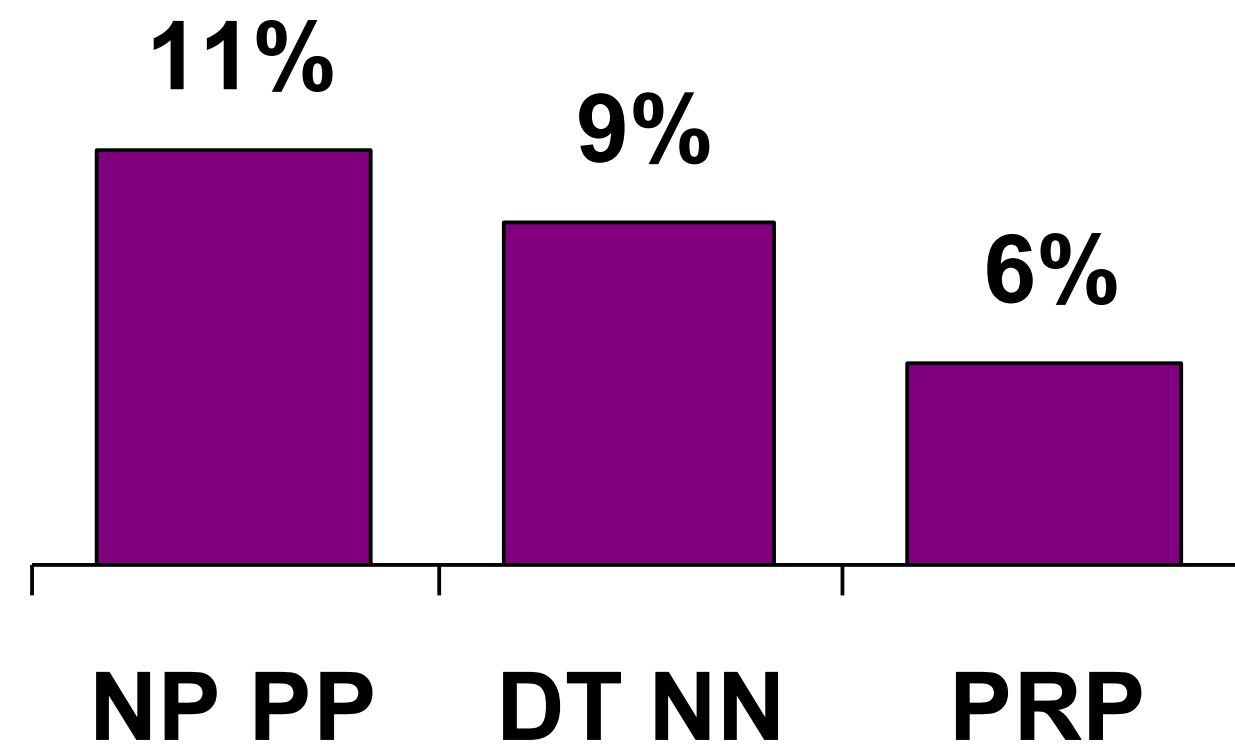
- ▶ Standard dataset for English: Penn Treebank (Marcus et al., 1993)
- ▶ “Vanilla” PCFG: ~71 F1
- ▶ Best PCFGs for English: ~90 F1
- ▶ State-of-the-art discriminative models (using unlabeled data): 95 F1
- ▶ Other languages: results vary widely depending on annotation + complexity of the grammar

# Refining Generative Grammars

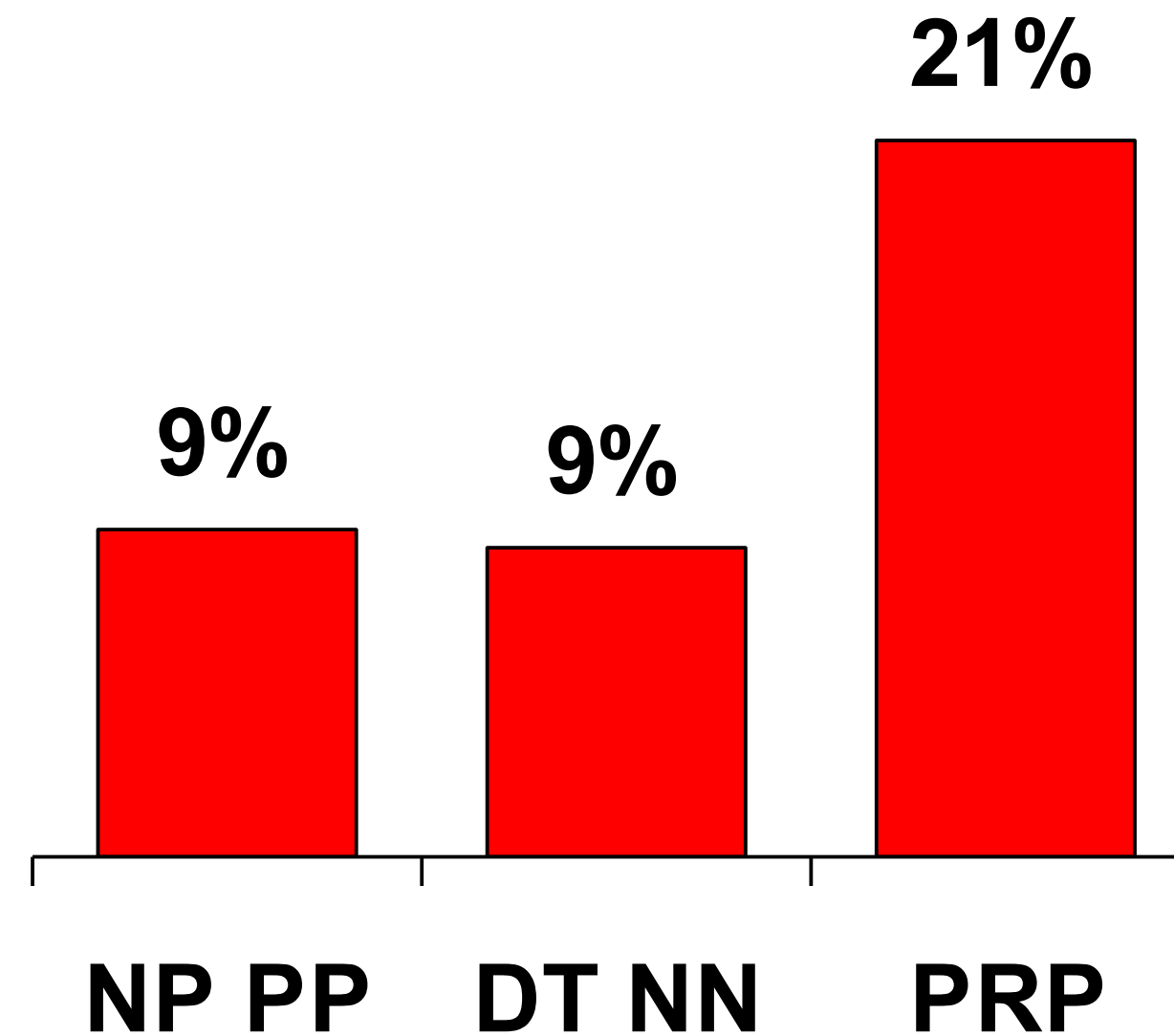


# PCFG Independence Assumptions

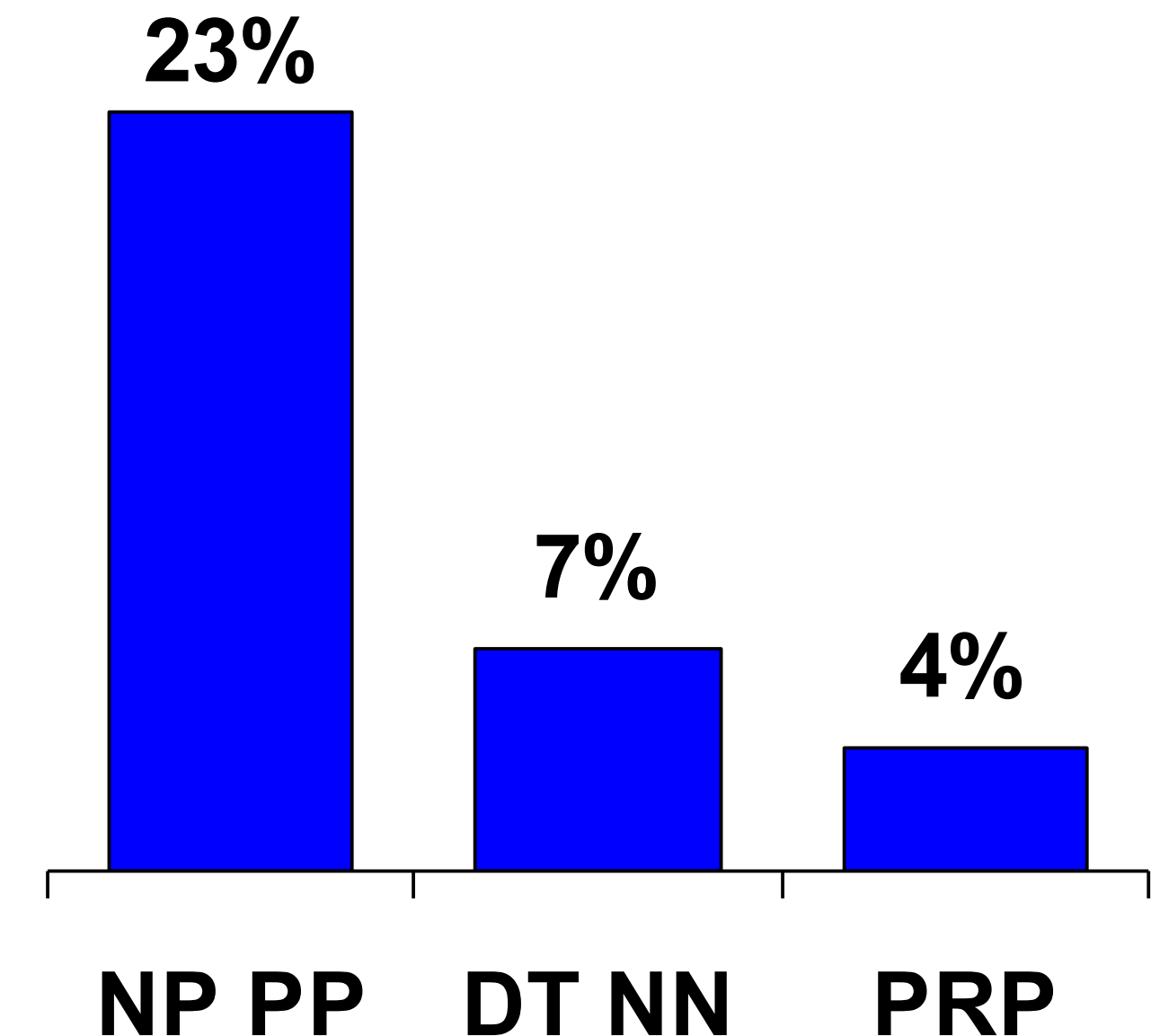
All NPs



NPs under S



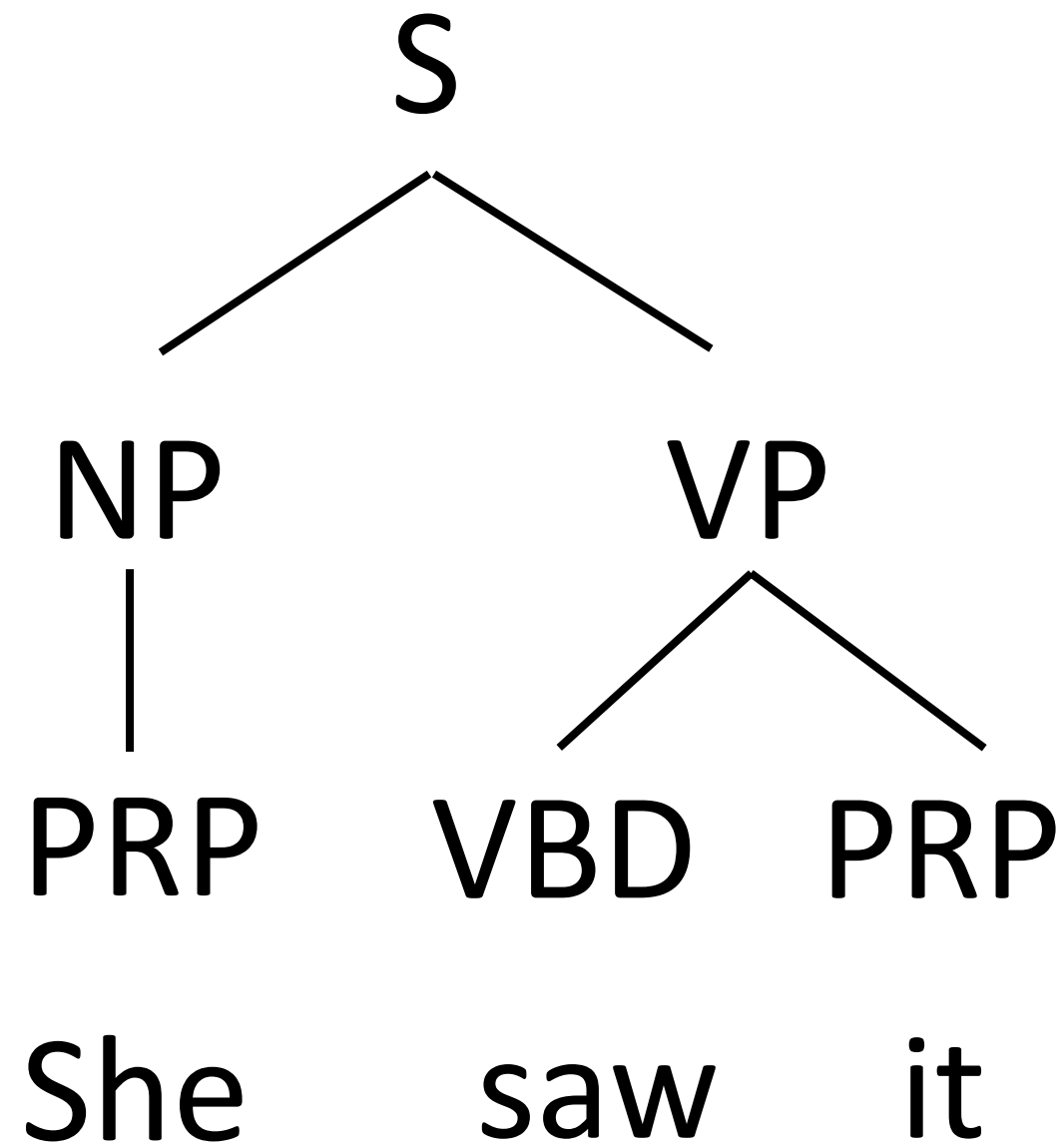
NPs under VP



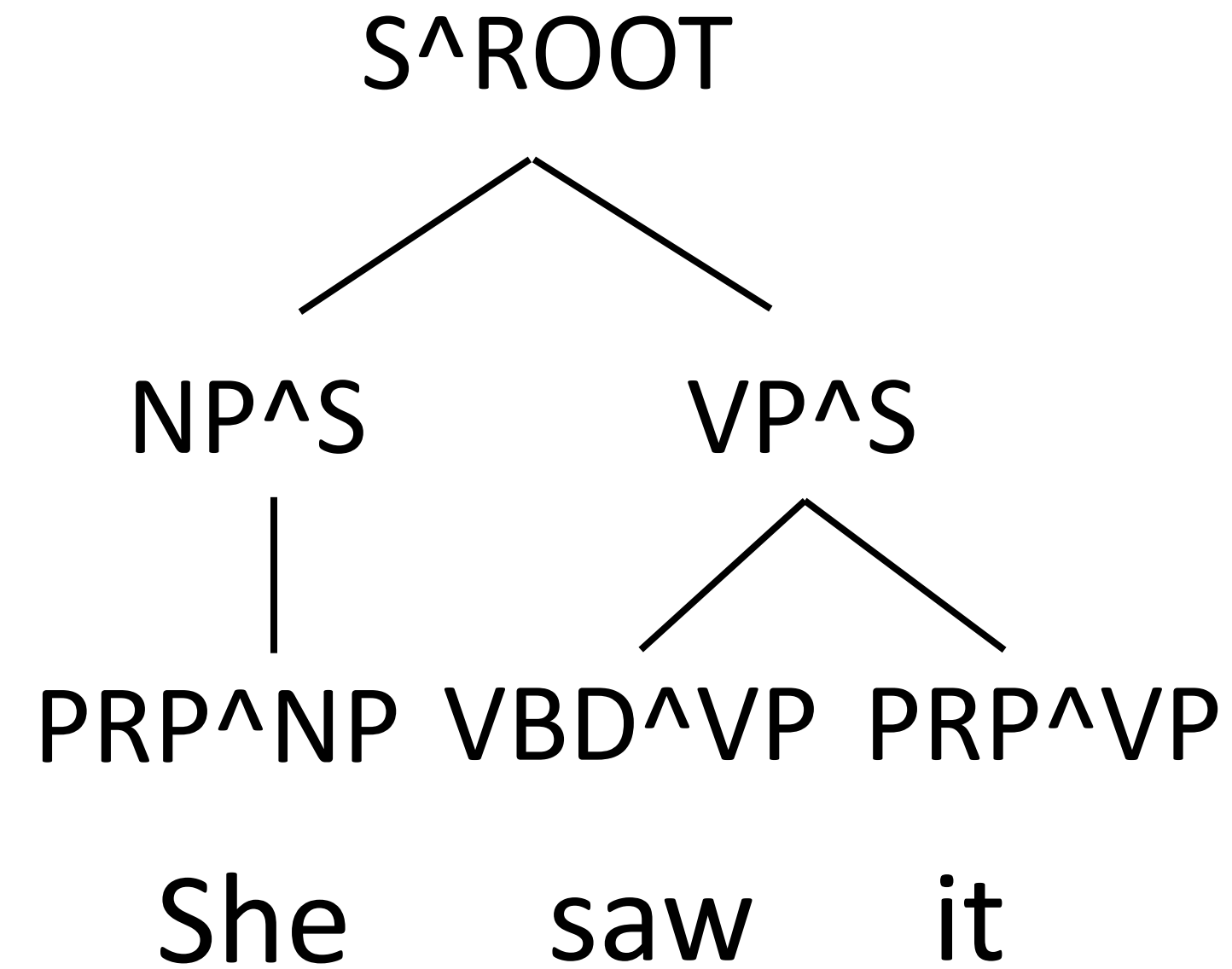
- ▶ Language is not context-free: NPs in different contexts rewrite differently
- ▶ [They]<sub>NP</sub> received [the package of books]<sub>NP</sub>



# Vertical Markovization



Basic tree ( $v = 1$ )



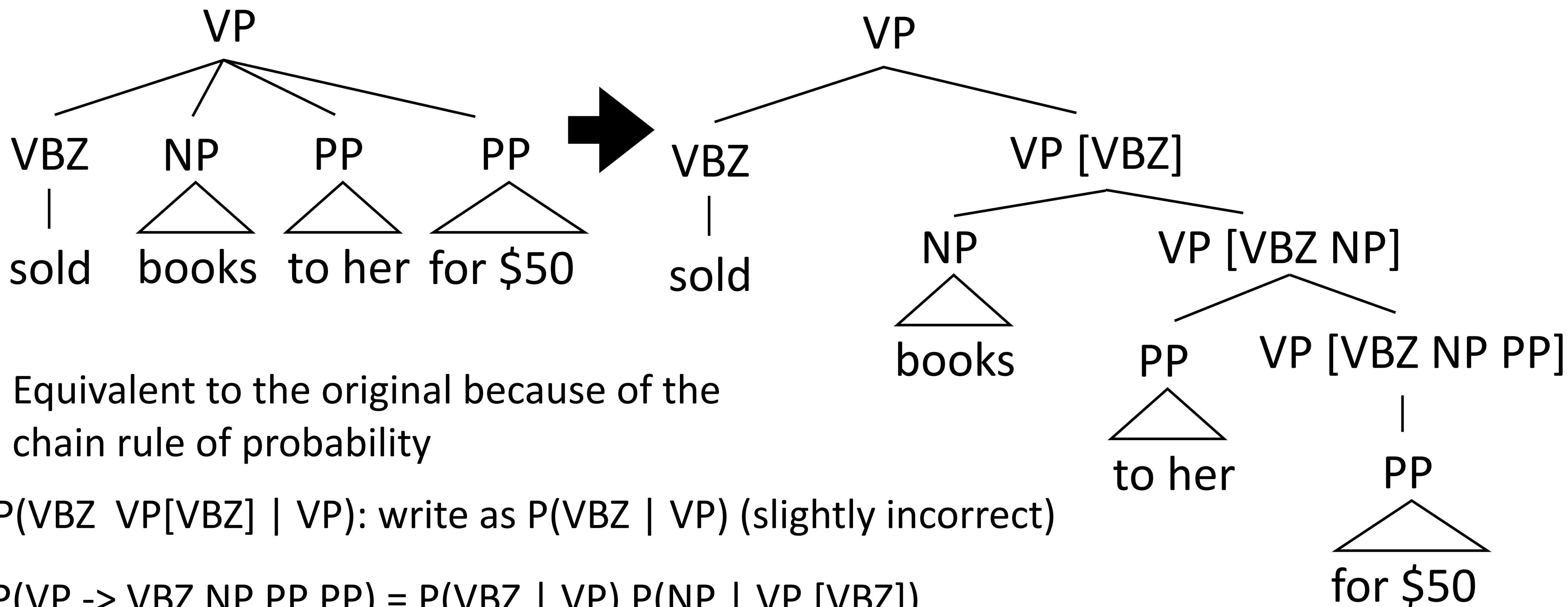
$v = 2$  Markovization

- Why is this a good idea?



# Binarization Revisited

- ▶ Another way of doing lossless binarization:



- ▶ Equivalent to the original because of the chain rule of probability

$P(\text{VBZ VP}[\text{VBZ}] \mid \text{VP})$ : write as  $P(\text{VBZ} \mid \text{VP})$  (slightly incorrect)

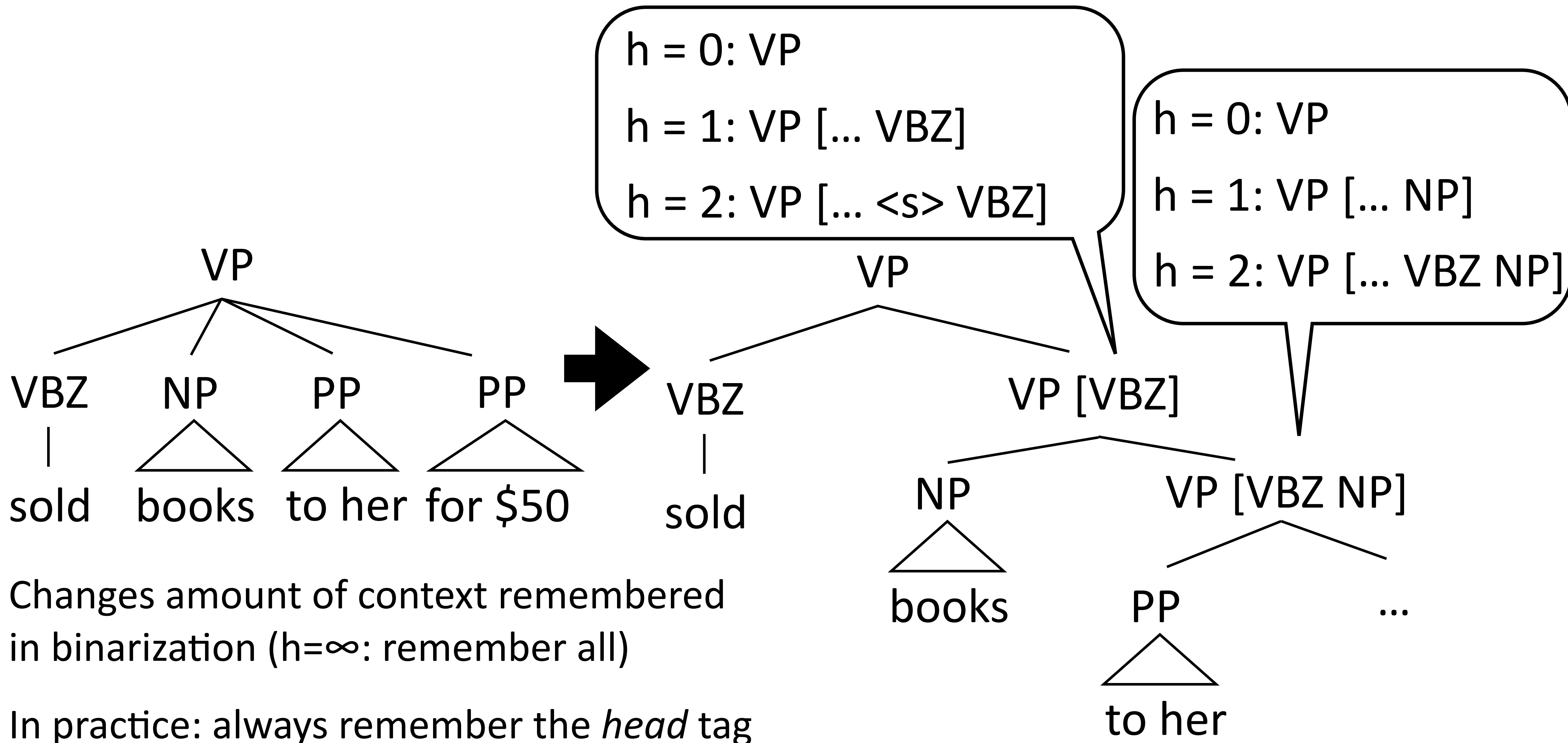
$P(\text{VP} \rightarrow \text{VBZ NP PP PP}) = P(\text{VBZ} \mid \text{VP}) P(\text{NP} \mid \text{VP} [\text{VBZ}])$

$P(\text{PP} \mid \text{VP} [\text{VBZ NP}]) P(\text{PP} \mid \text{VP} [\text{VBZ NP PP}])$





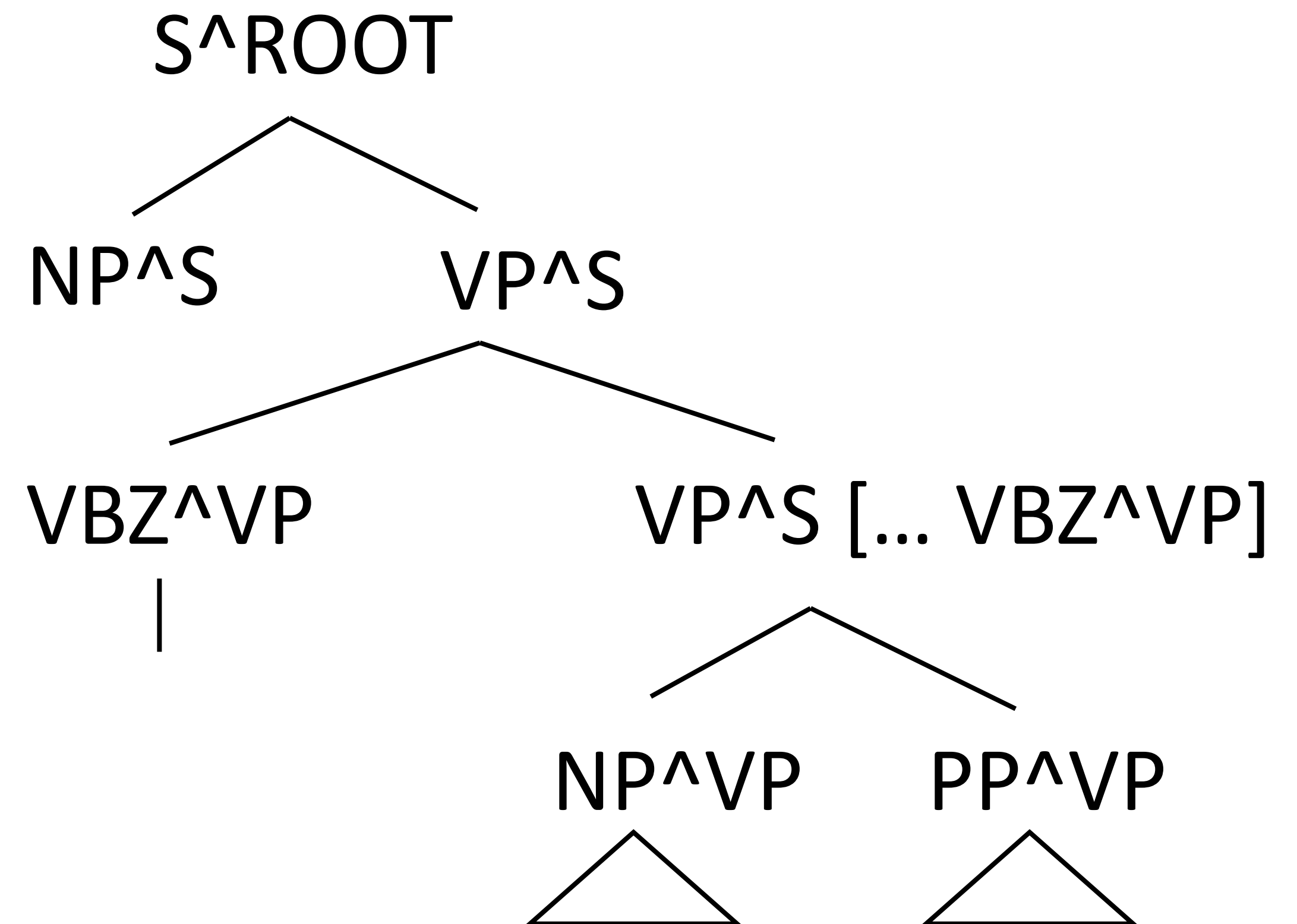
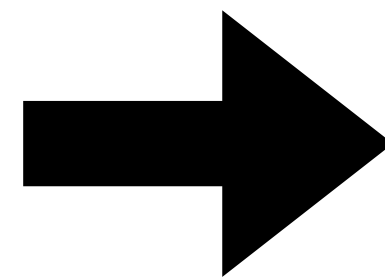
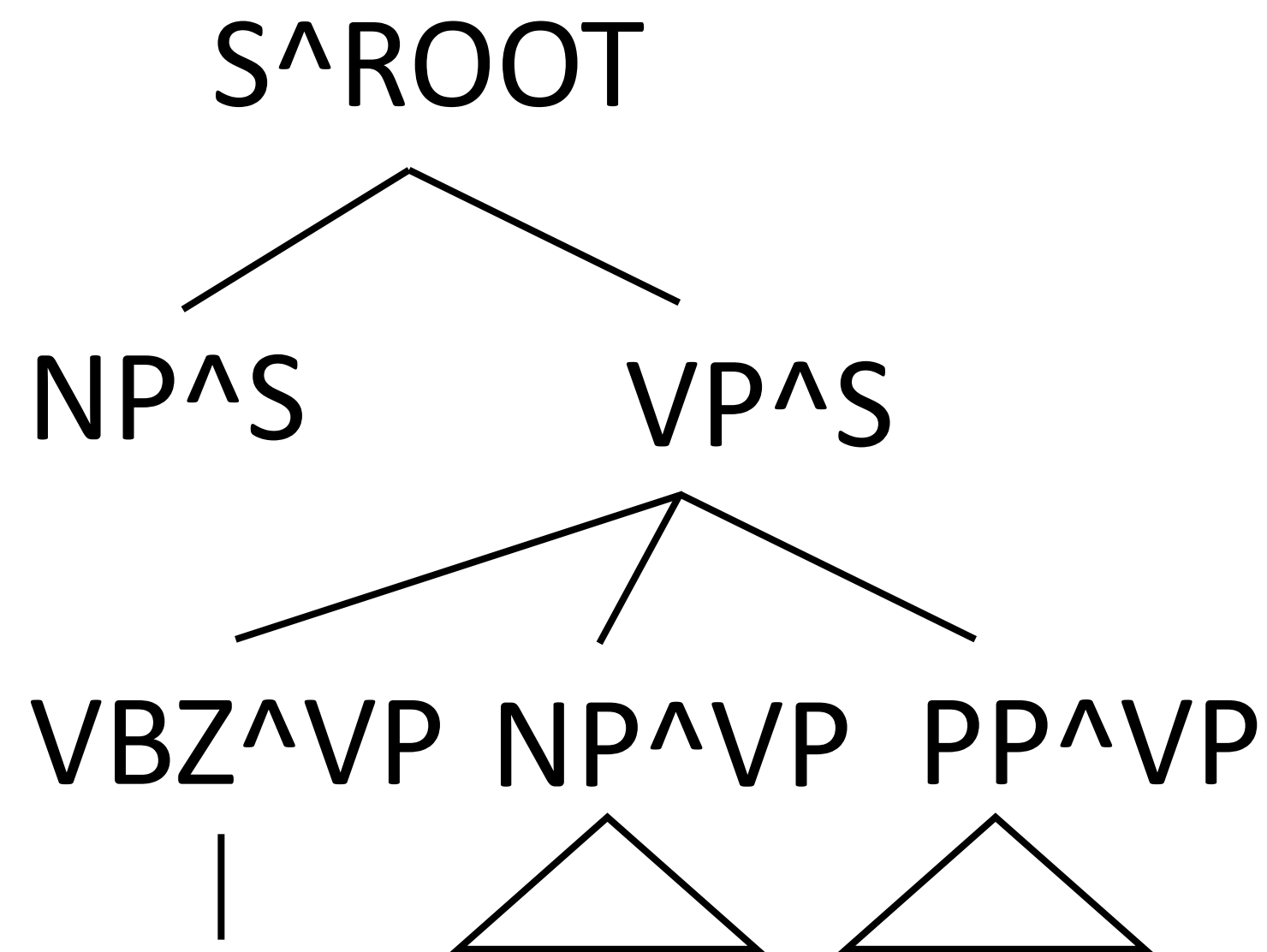
# Horizontal Markovization





# Annotating Trees

- First apply vertical Markovization, then binarize + apply horizontal





# Annotating Trees

		Horizontal Markov Order				
Vertical Order		$h = 0$	$h = 1$	$h \leq 2$	$h = 2$	$h = \infty$
$v = 1$	No annotation	71.27 (854)	72.5 (3119)	73.46 (3863)	72.96 (6207)	72.62 (9657)
$v \leq 2$	Sel. Parents	74.75 (2285)	77.42 (6564)	77.77 (7619)	77.50 (11398)	76.91 (14247)
$v = 2$	All Parents	74.68 (2984)	77.42 (7312)	77.81 (8367)	77.50 (12132)	76.81 (14666)
$v \leq 3$	Sel. GParents	76.50 (4943)	78.59 (12374)	79.07 (13627)	78.97 (19545)	78.54 (20123)
$v = 3$	All GParents	76.74 (7797)	79.18 (15740)	79.74 (16994)	79.07 (22886)	78.72 (22002)

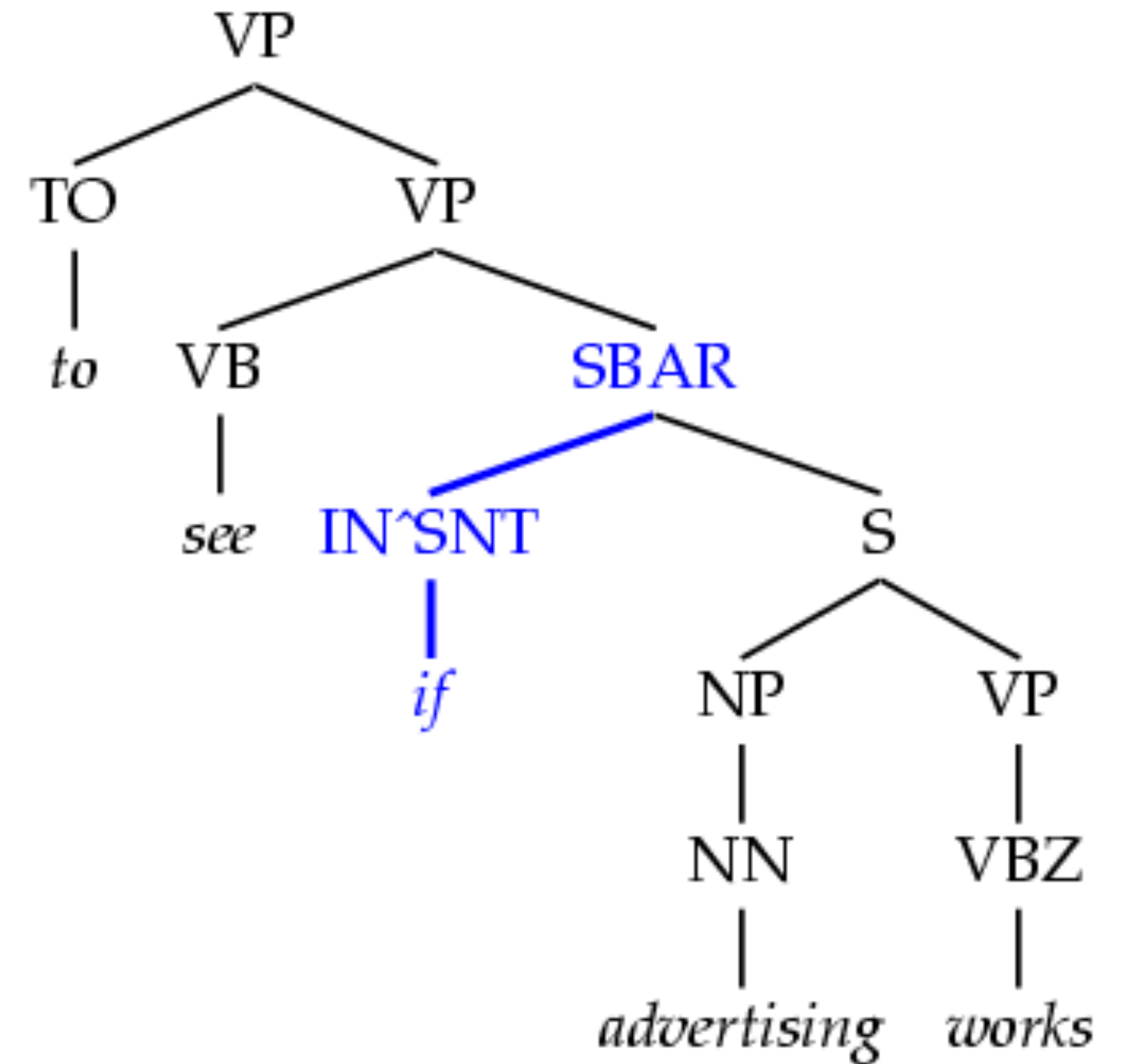
Figure 2: Markovizations:  $F_1$  and grammar size.

Klein and Manning (2003)



# Tag Splits

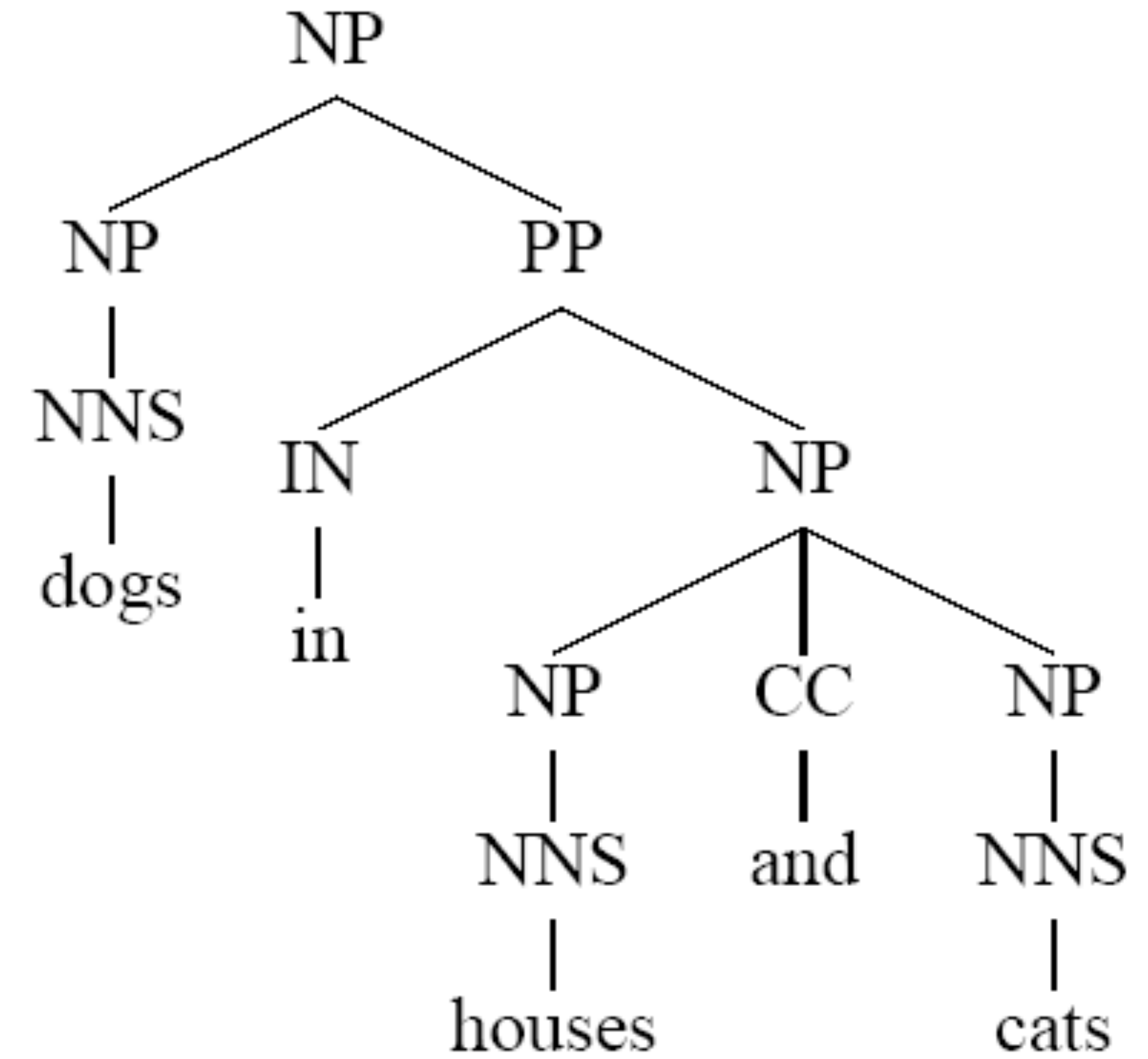
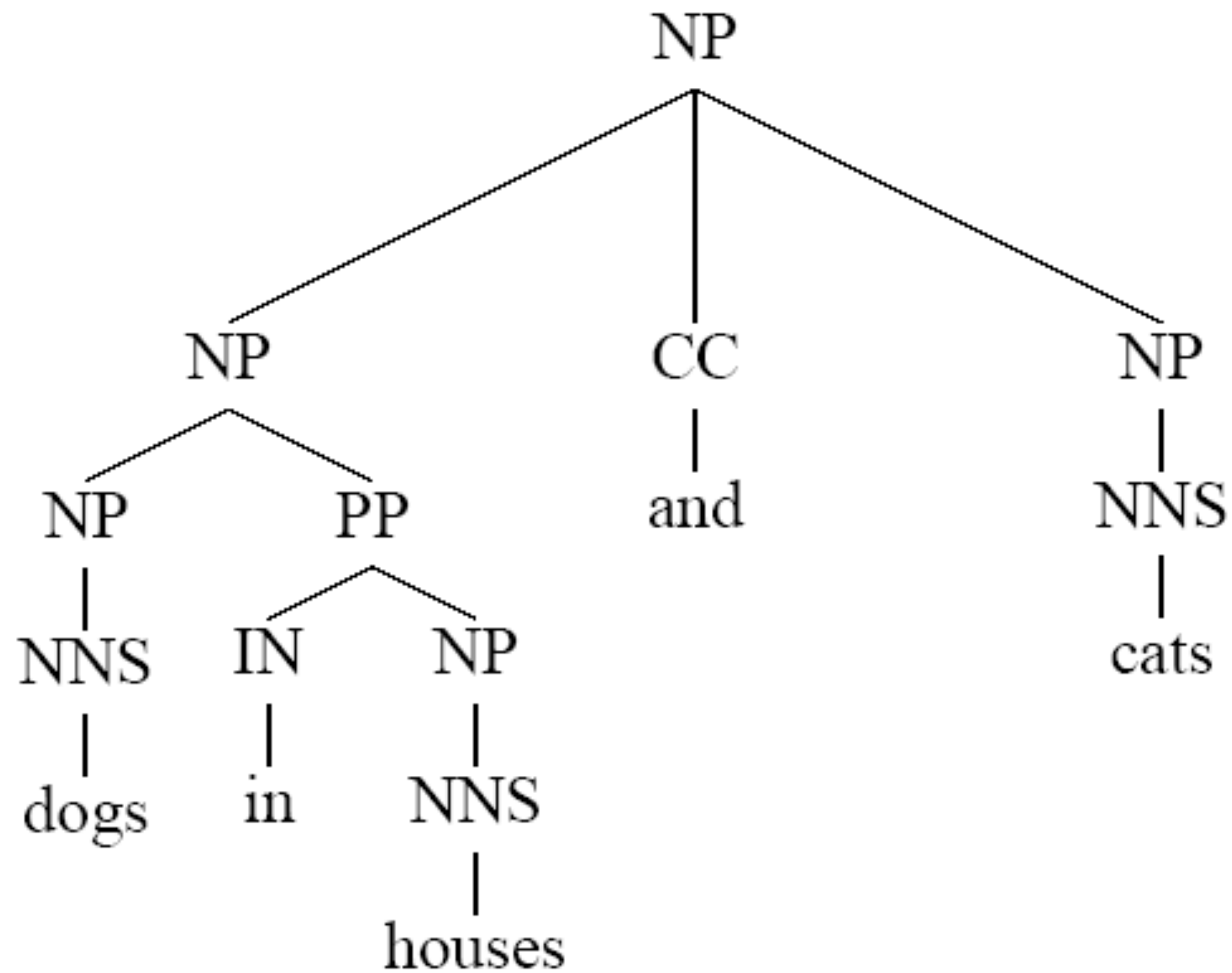
- ▶ Can do some other specialized tag splits: e.g., sentential prepositions behave differently from other prepositions
- ▶ 79 F1 => 86.3 F1 using more tricks



# Other Parsers



# Lexicalized Parsers



- ▶ Even with parent annotation, these trees have the same rules. Need to use the words





# Lexicalized Parsers

- ▶ Annotate each grammar symbol with its “head word”: most important word of that constituent
- ▶ Rules for identifying headwords (e.g., the last word of an NP before a preposition is typically the head)
- ▶ Collins and Charniak (late 90s):  
~89 F1 with these

