

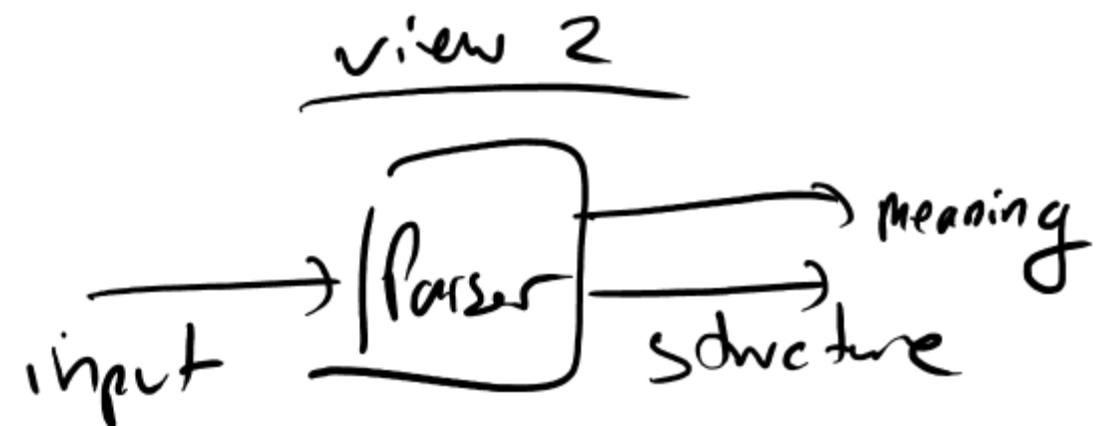
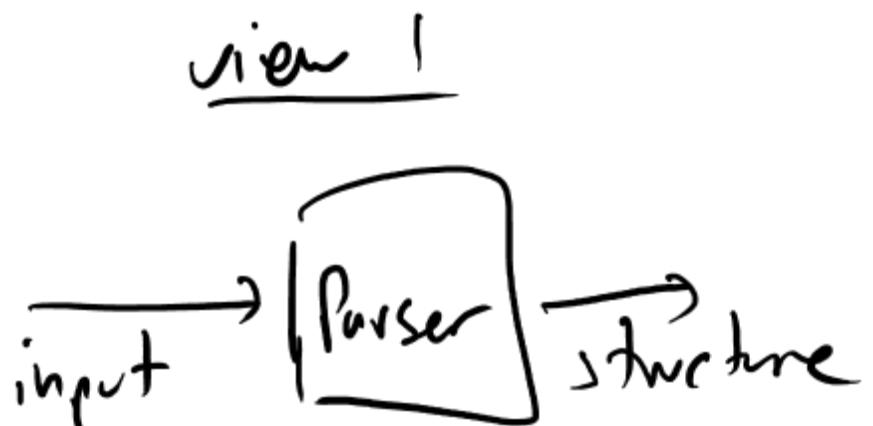
# Parsing

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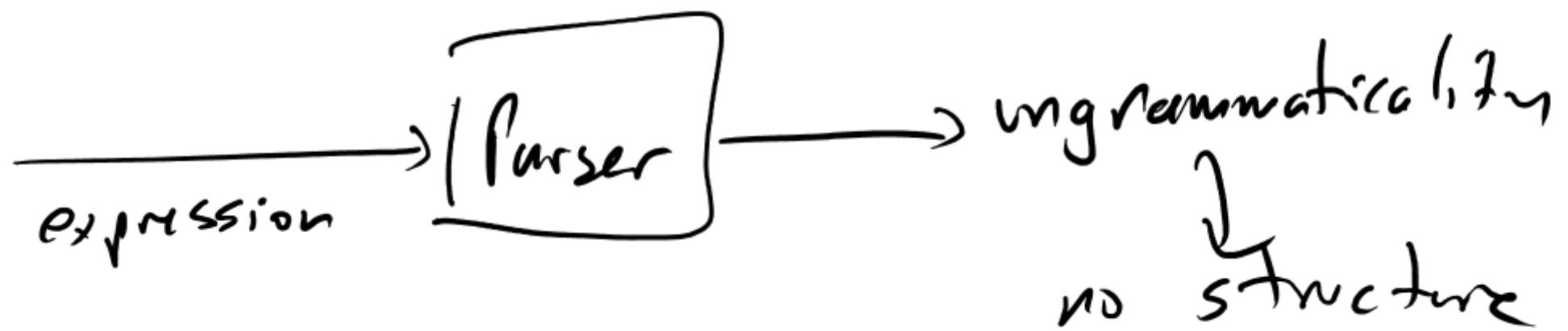
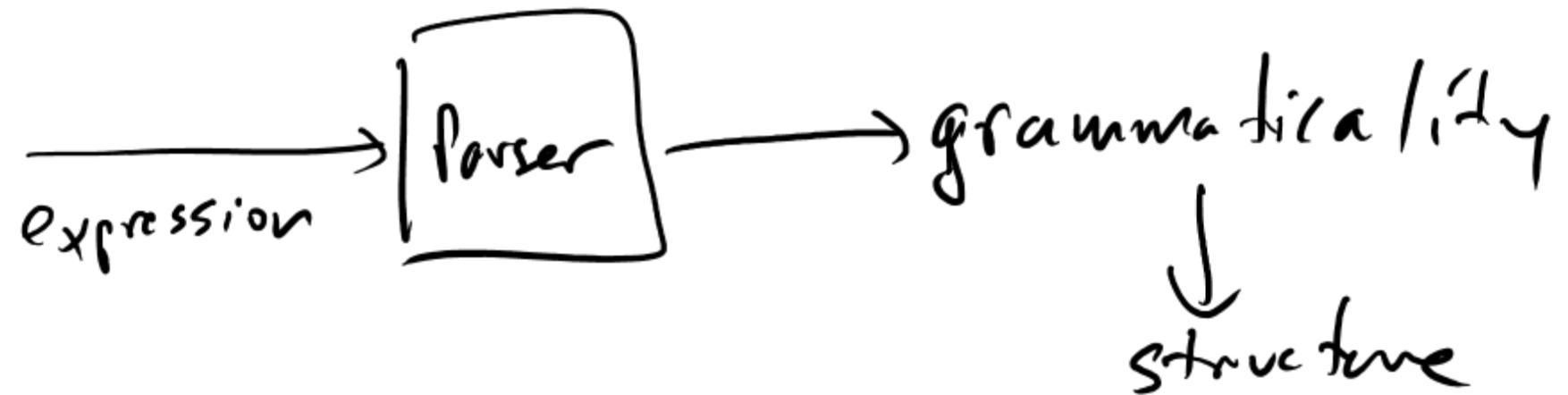
Bogazici Linguistics  
LING 488

Cem Bozsahin

- Parsing is the process of revealing the structure of an expression.



- View 2 also asks why we build that structure



# Linguistic takes on parsing

- Chomsky (2000): Parsing is not a reflex.
  - . It does not have to have an algorithm .
  - . Recently, there are efforts to take numeration to spell-out in the Minimalist program
- Garrett, Fodor (1980+): Parsing is a reflex. Try turning it off!  
(Bernick & Stabler 2019)

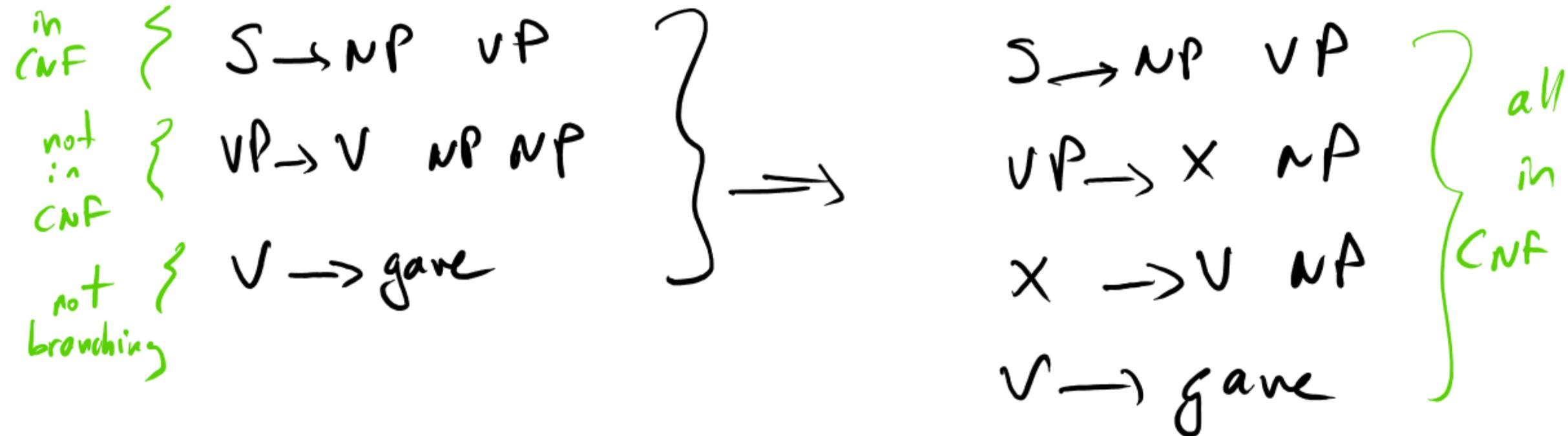
- What would it look like if it had an algorithm?
- Parsing is a major cottage industry in Computational linguistics.
- It is a field by itself in Computer Science.

Long story short: Any phrase-structure grammar can be turned into something with binary branching.

1950s

- This is called the Chomsky Normal form.
- X-bar theory is a linguistic version of <sup>1970s</sup> that.
- This means one-argument-at-a-time, if there is branching.
- We have known this since Schönfinkel (1920)!

A formal exercise in binarizing a PSG:



- Categorial grammars are already one-argument-at-a-time.
- That is not mathematical reductionism ; it is the most natural way to treat ALL categories as FUNCTIONS (not labels).
- The added benefit is the ability to derive the meaning as we parse.

- The simplest and most common binary parser is CKY.
- Cocke-Kasami-Younger (1967-1970)
  - It is a rediscovery. Hiroo Sakai invented it in 1961.
    - (also CKY)
- It works on MODELS of grammar, using bottom-up parsing and dynamic programming.

The idea:

- For an expression of length  $n$ , make a matrix of size  $n$ .
- It is enough for the table to be a lower-triangular matrix, since the upper-triangle is not needed - we will see why.
- Fill every entry with combinations of the form  $n = x + y$  but not  $n = y + y + z$  etc.

For example, if we have an expression  
of length 5:

- constituents of length 1 : lexical categories
- " " " 2 : 1+1 (from pos. 1)
- " " " 3 : 1+2, 2+1  
starting from  
position 1 and 2.  
*(but not 1+(+1))*
- " " " 4 : 2+2, 1+3, 3+1  
*(but not 2+1+1, 1+2+1 etc.)*
- " " " 5 : 2+3, 3+2, 1+4, 4+1

## Phrase-structure example:

$S \rightarrow NP VP$

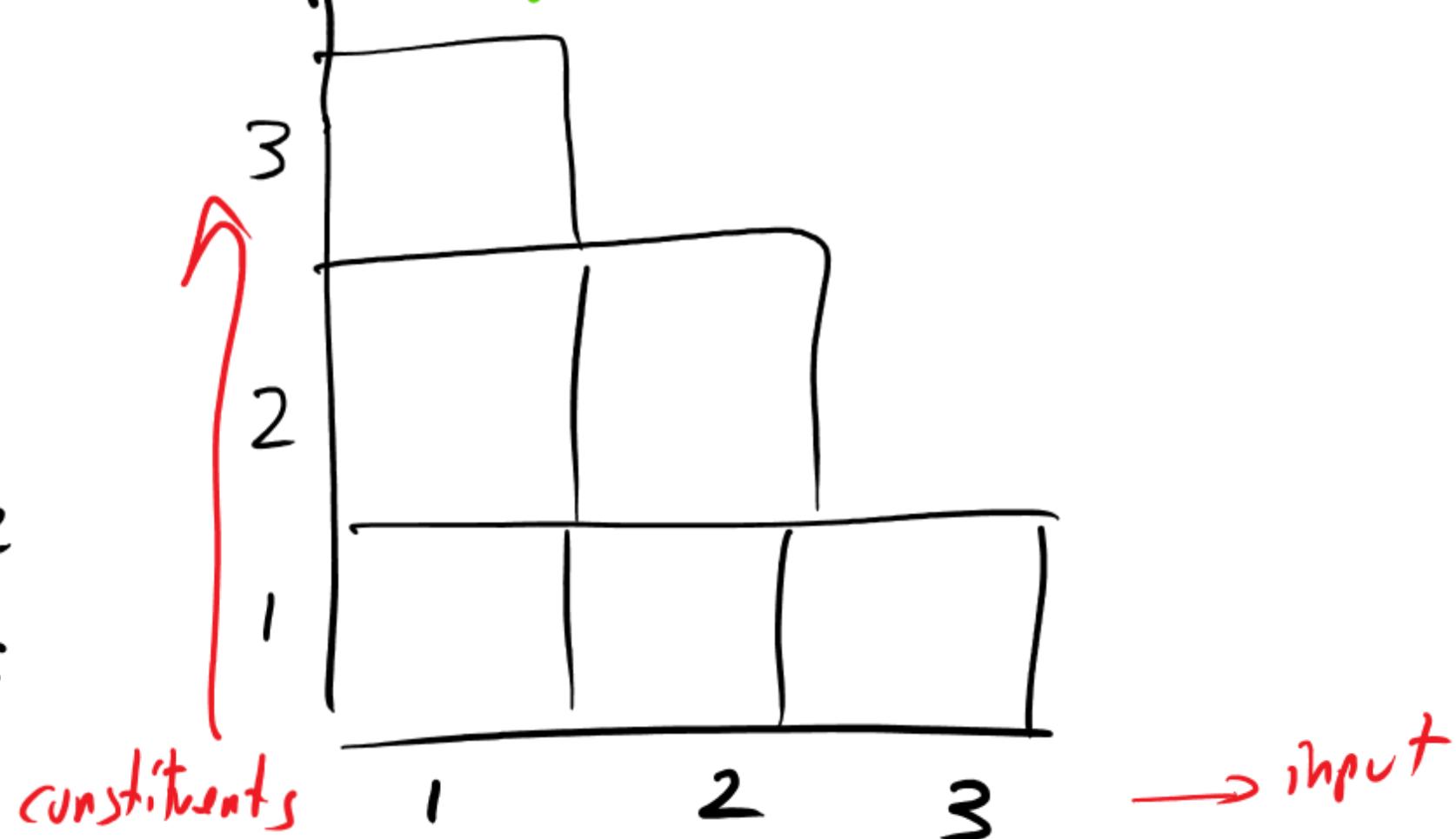
$NP \rightarrow John Mary$

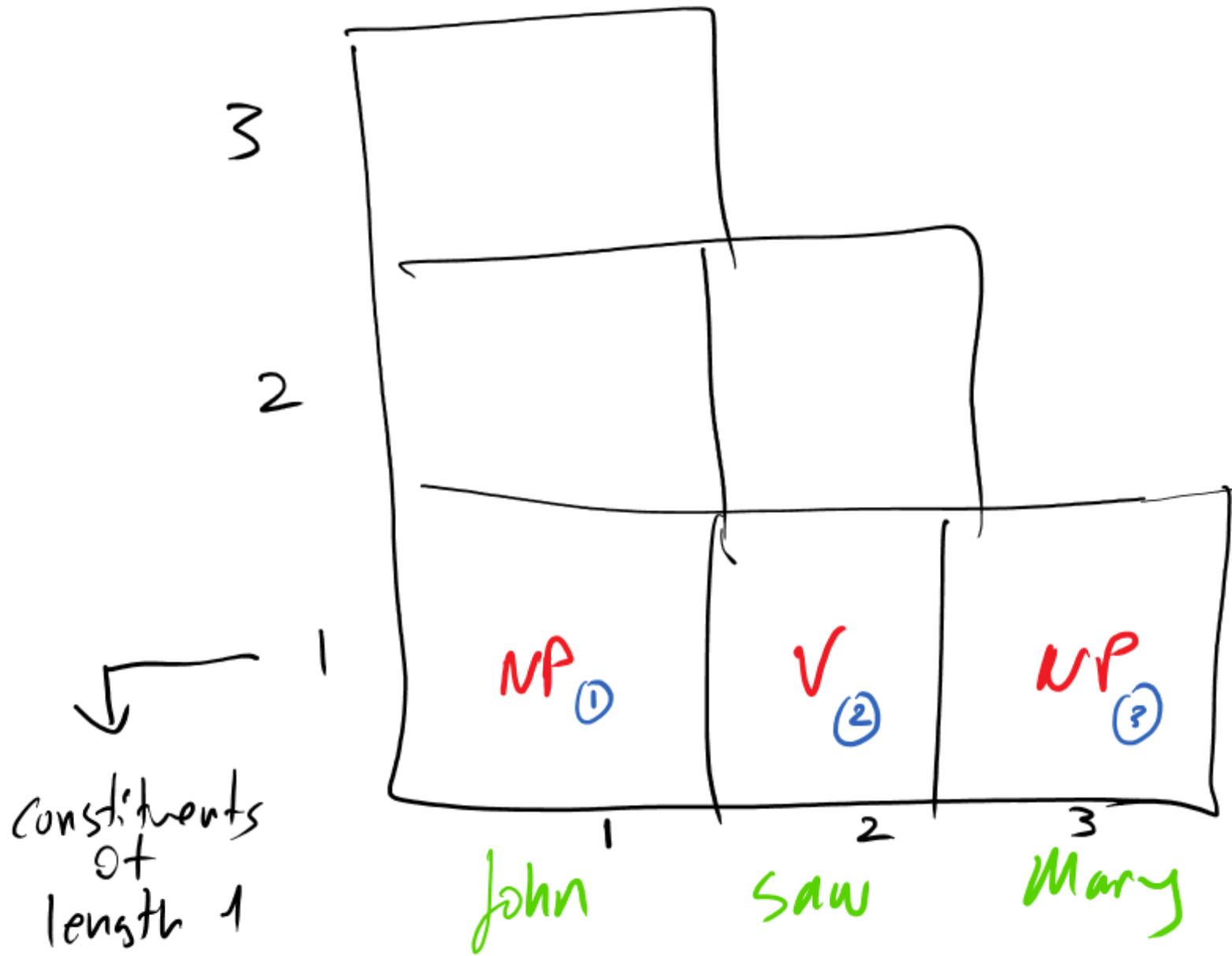
$VP \rightarrow V NP$

$V \rightarrow saw$

Start like  
this:

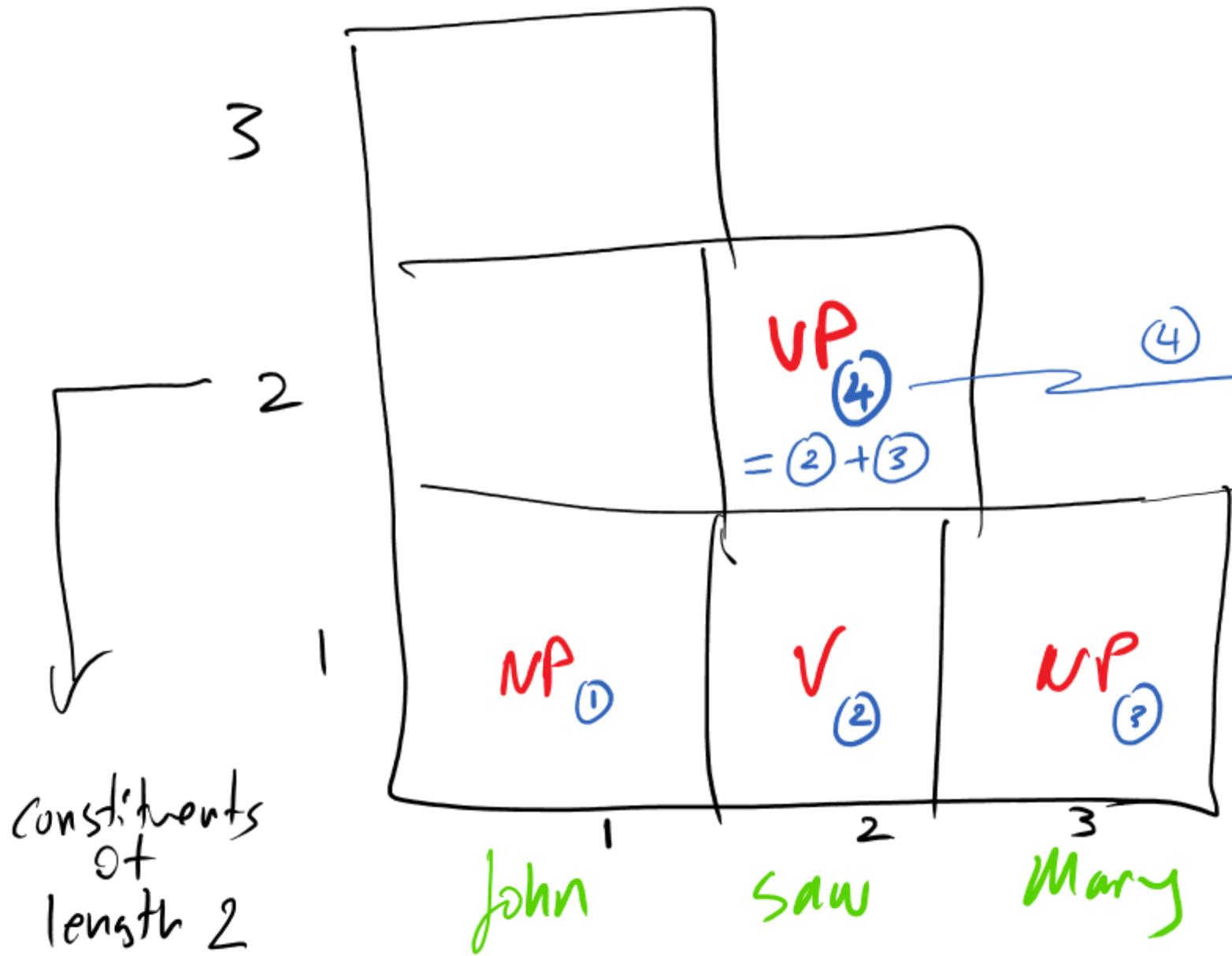
input: John saw Mary





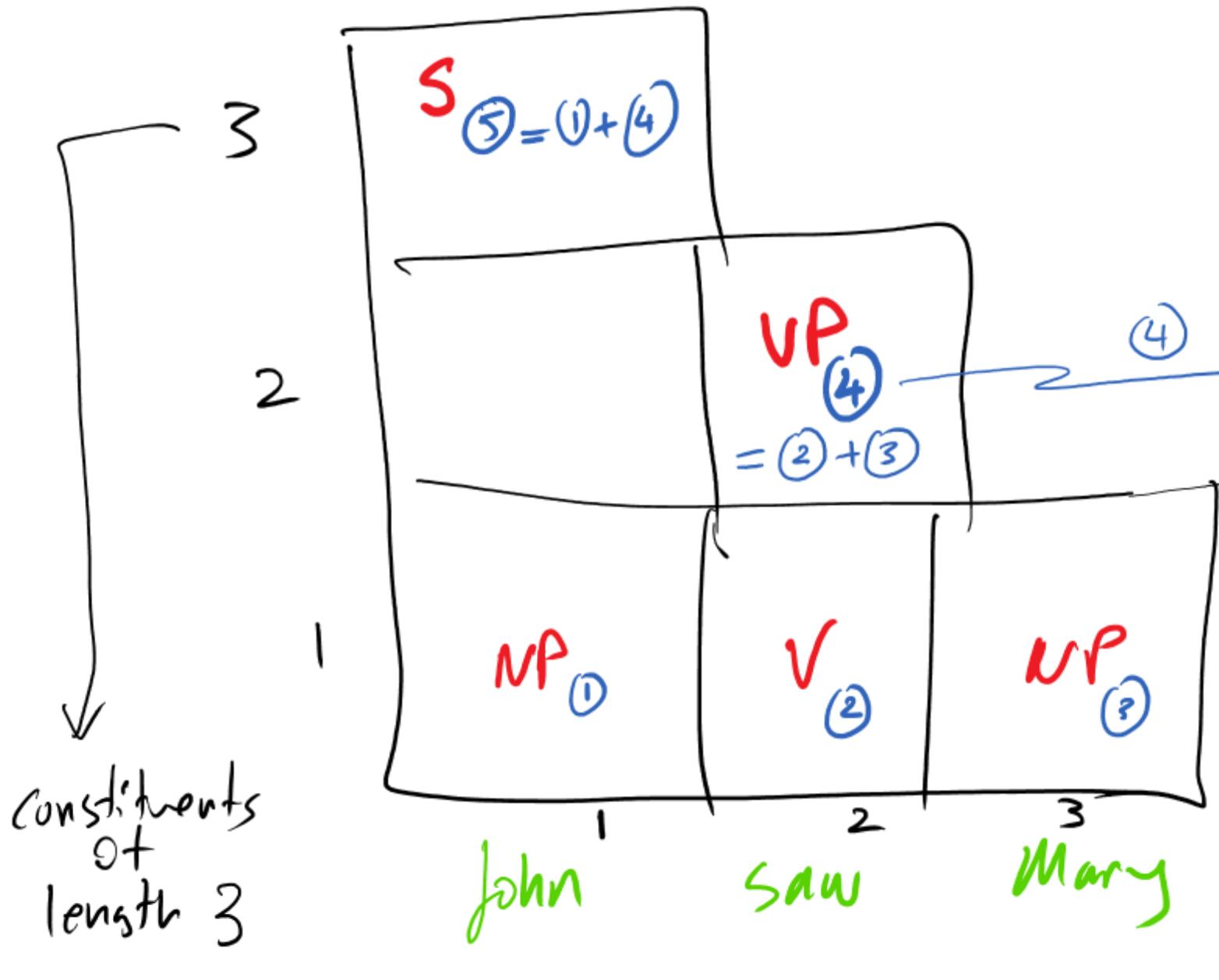
- $S \rightarrow NP \quad VP$   
 ①  $NP \rightarrow John$   
 ③  $NP \rightarrow Mary$   
 $VP \rightarrow V \quad NP$   
 ②  $V \rightarrow saw$

now build  
constituents of  
length 2 →



- $S \rightarrow NP \quad VP$
- $NP \rightarrow John$
- $NP \rightarrow Mary$
- $VP \rightarrow V \quad NP$
- $V \rightarrow saw$

now build  
 constituents of  
 length 3 →



- $S \rightarrow NP \quad VP$
- $NP \rightarrow John$
- $VP \rightarrow V \quad NP$
- $V \rightarrow saw$
- $\textcircled{1}$
- $\textcircled{3}$
- $\textcircled{2}$
- $\textcircled{4}$

---

Length 3 constituents

$$3 = 1 + \text{length } 2$$

$\uparrow$        $\uparrow$

$$3 = \text{length } 2 + 1$$

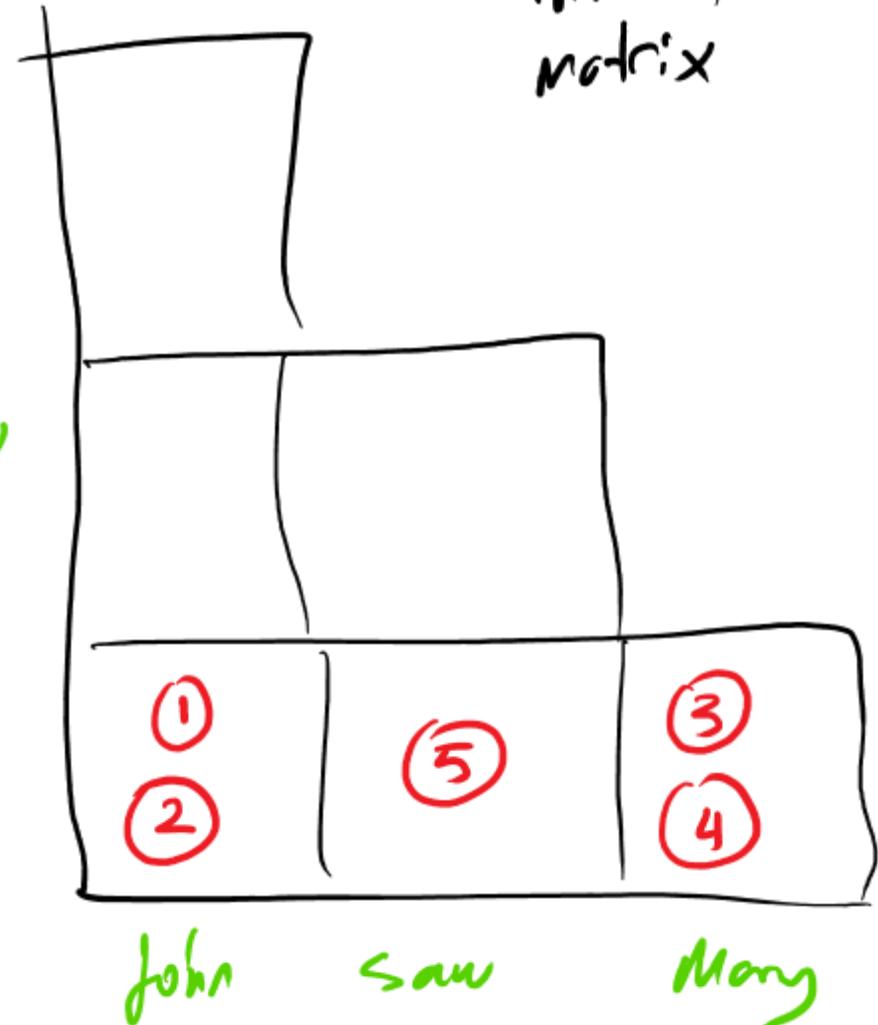
$\uparrow$        $\uparrow$

start position    end pos.

# CKY for Categorial grammar

: categories are pairs of command rel.

John :: NP: j' ①  
  :: S/(S\NP): NP·P J' ②



Many :: NP: m' ③  
  :: (S\NP)\((S\NP)\/NP): NP·P J' ④

saw :: (S\NP)\NP:  $\lambda x \lambda y. \text{see}' x y$  ⑤

"Rules":  $\boxed{x/y:f \quad \gamma:a \rightarrow x:fa}$

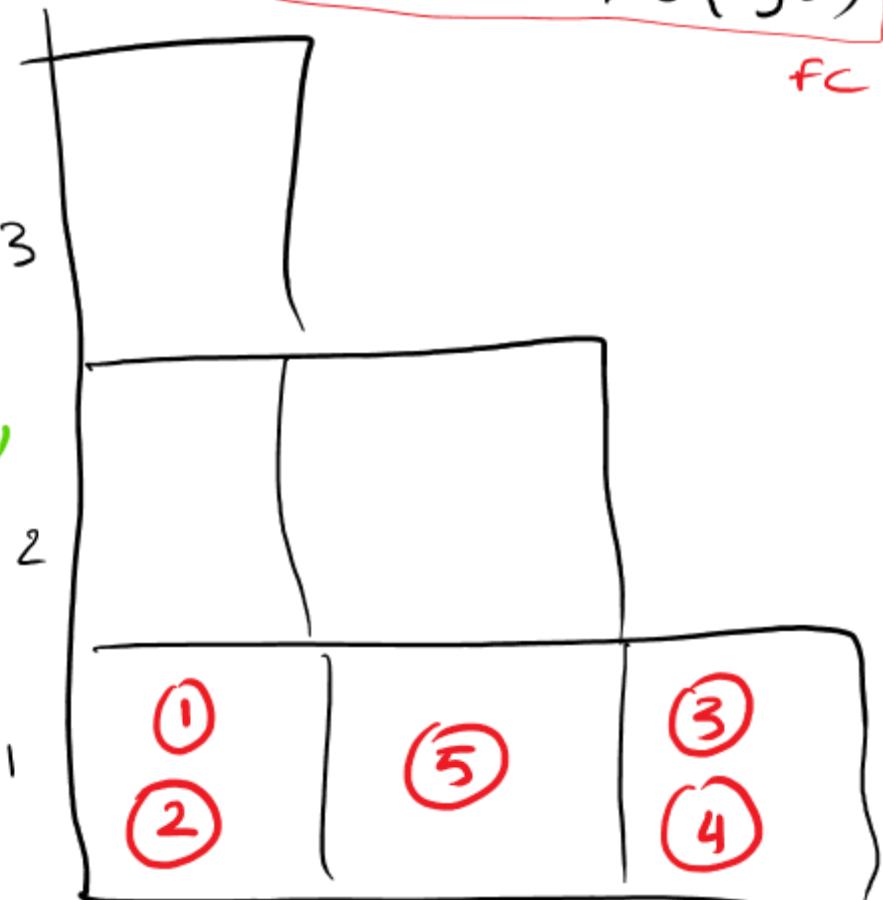
$\gamma:a \quad x/y:f \rightarrow x:fa$

John ::  $NP:j'$  ①  
 ::  $S/(S\backslash NP):NP.PJ'$  ②

Many ::  $NP:m'$  ③  
 ::  $(S\backslash NP)\backslash((S\backslash NP)\backslash NP):NP.PJ'$  ④

saw ::  $(S\backslash NP)\backslash NP: \lambda x \lambda y. see' x y$  ⑤

$x/y:f \quad \gamma/z:g$   
 $\rightarrow x/z:$   
 $\pi z. f(gz)$



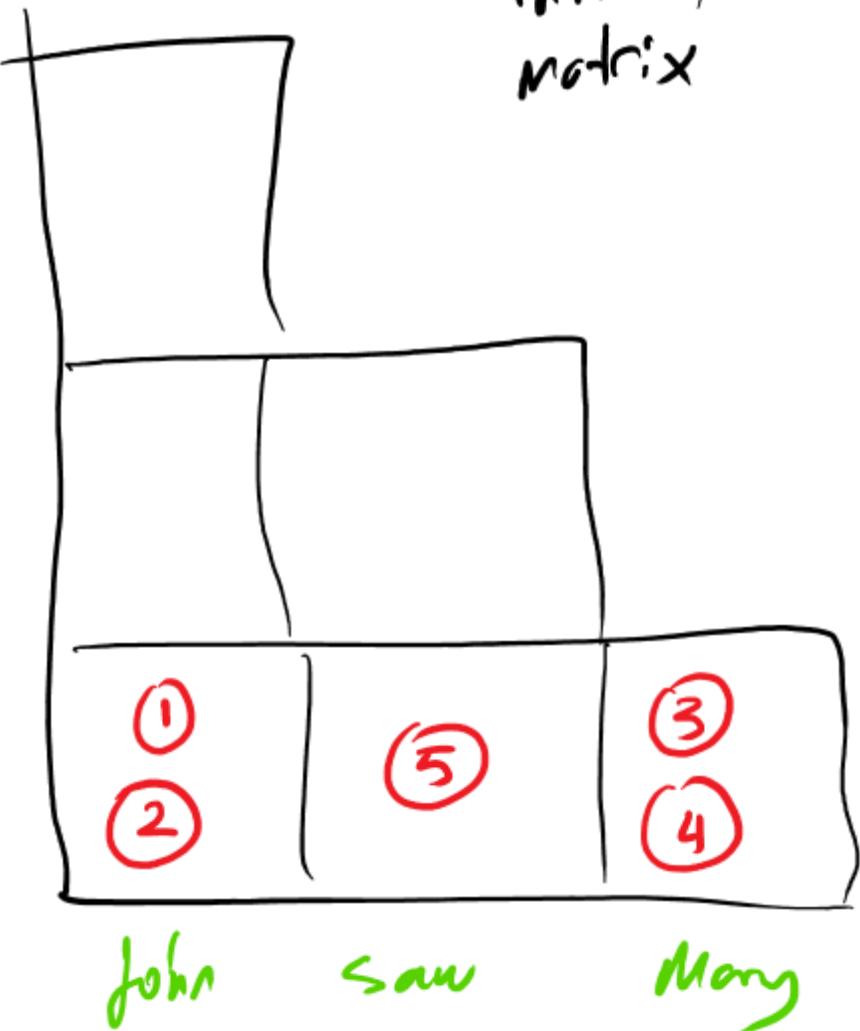
FA: forward application    FC: forward composition  
 BA: backward "

# CKY for Categorial grammar

John :: NP:  $\bar{J}'$  ①  
:: S/(S\NP): NP.P  $\bar{J}'$  ②

Many :: NP:  $m'$  ③  
:: (S\NP)\((S\NP)\NP): NP.P  $\bar{J}'$  ④

Saw :: (S\NP)\NP:  $\lambda x \lambda y. \text{see}' x y$  ⑤

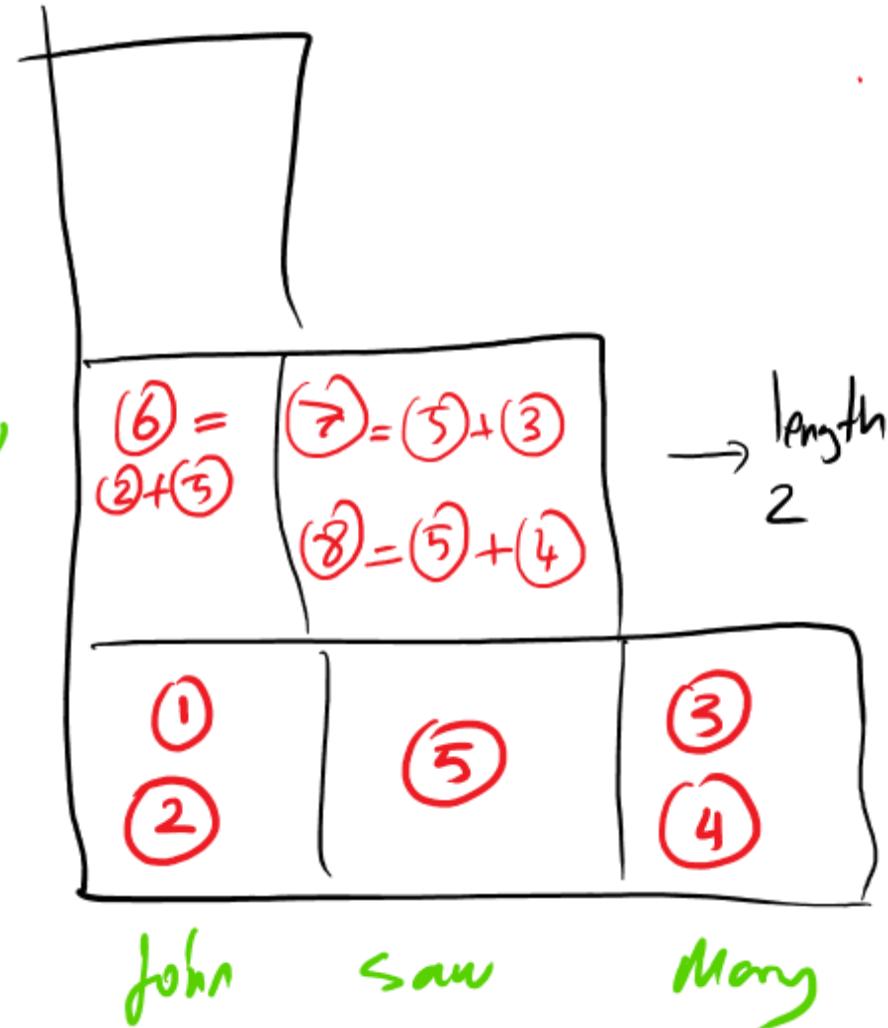


# Cry for Categorial grammar

John :: NP: j' ①  
:: S/(S\NP): AP.P J' ②

Many :: NP:n' (3)  
:: (S\NP)\((S\NP)\NP):\Pi\_{P,P}\bar{J}' (4)

saw :: (s\inp) \inp: \lambda x \lambda y. see' x y



$$\textcircled{6}^{\text{FC}} = S/(S \setminus NP) \quad (S \setminus NP)/NP \rightarrow S \setminus NP$$

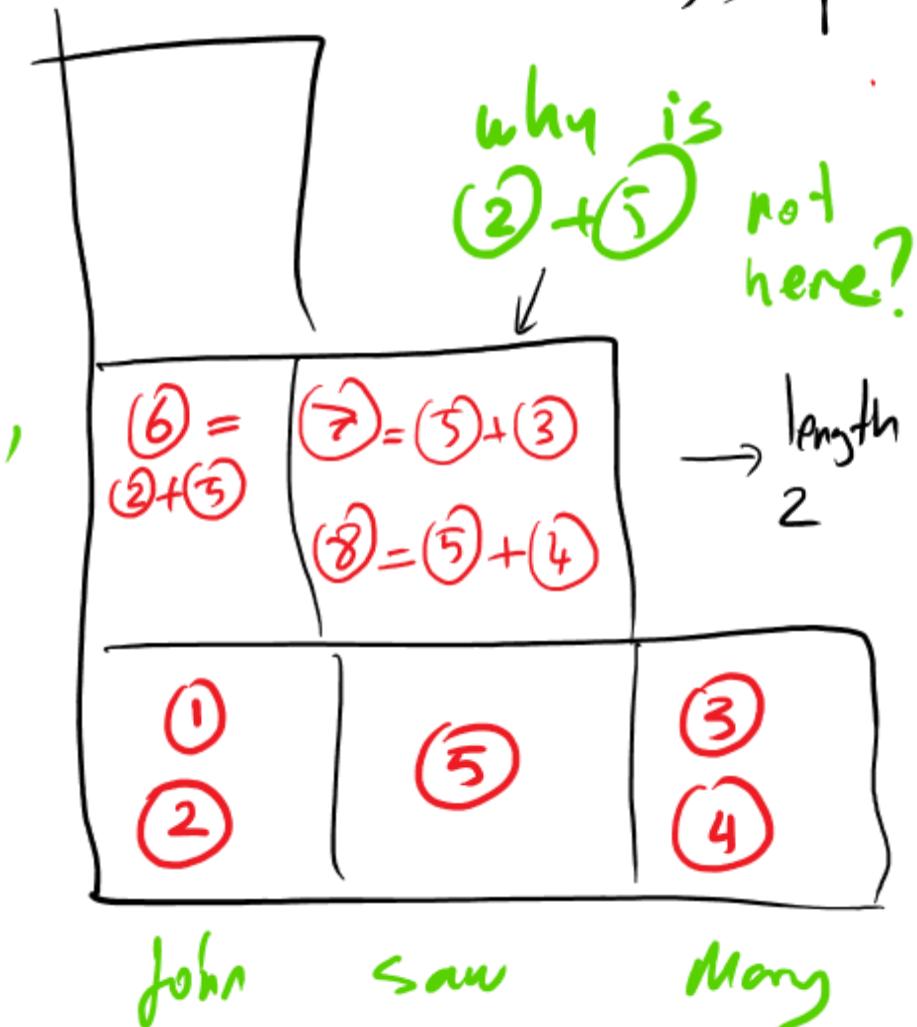
John :: NP:  $\bar{J}'$  ①  
   ::  $S/(S \setminus NP): \pi_P \cdot P \bar{J}'$  ②

Many :: NP:  $m'$  ③  
   ::  $(S \setminus NP) \setminus ((S \setminus NP)/NP): \pi_P \cdot P \bar{J}'$  ④

saw ::  $(S \setminus NP)/NP: \lambda x \lambda y. \text{see}' x y$  ⑤

$$\textcircled{7}^{\text{FA}} = (S \setminus NP)/NP \quad NP \rightarrow S \setminus NP$$

$$\textcircled{8}^{\text{BA}} = (S \setminus NP)/NP \quad (S \setminus NP) \setminus ((S \setminus NP)/NP) \rightarrow S \setminus NP$$



$$\textcircled{6}^{\text{FC}} = s/(s\backslash np) \quad (s\backslash n_1)/np \rightarrow s\backslash np$$

↑ syntax + semantics?

$$\begin{aligned}\textcircled{7}^{\text{FA}} &= (s\backslash np)/np \quad np \rightarrow s\backslash np \\ \textcircled{8}^{\text{BA}} &= (s\backslash np)/np \quad (s\backslash np)\backslash((s\backslash np)/np) \\ &\rightarrow s\backslash np\end{aligned}$$

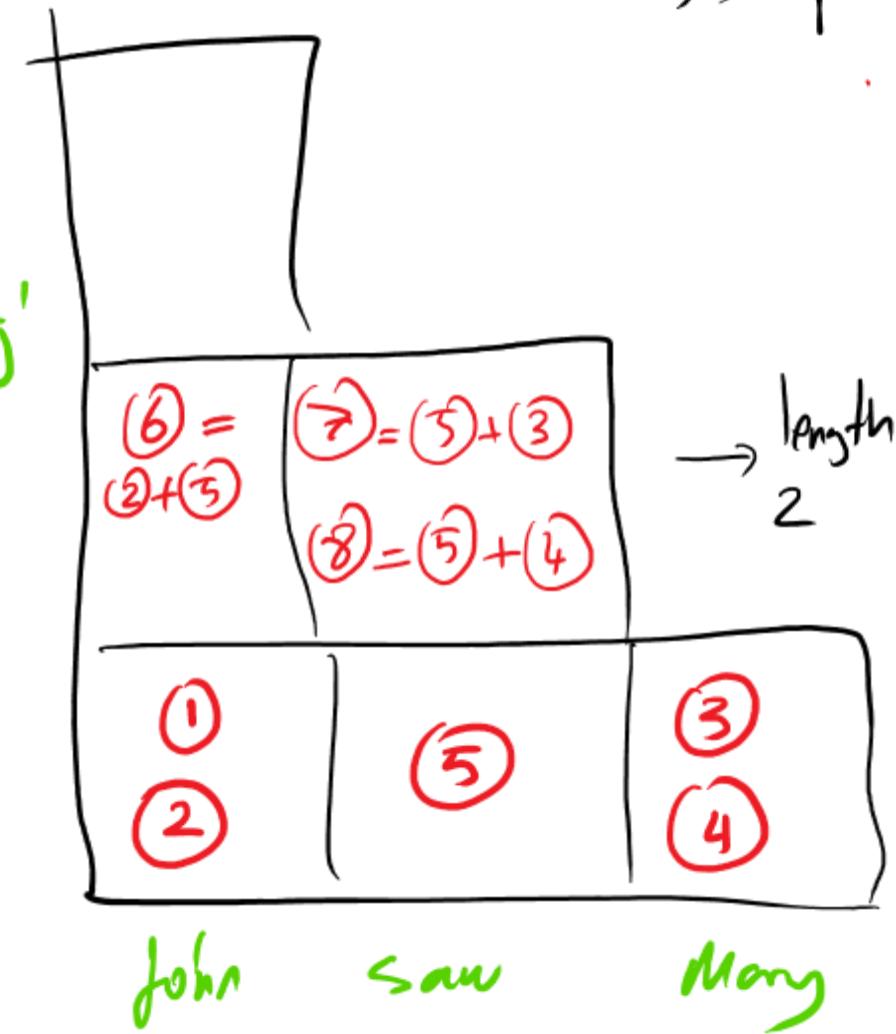
$$\begin{aligned}\textcircled{6} &= \\ s/(s\backslash np) &\quad (s\backslash n_1)/np \rightarrow s\backslash np \\ : \lambda p. p J' &\quad : \lambda x. \lambda y. see' xy \quad \lambda z. see' z J'\end{aligned}$$

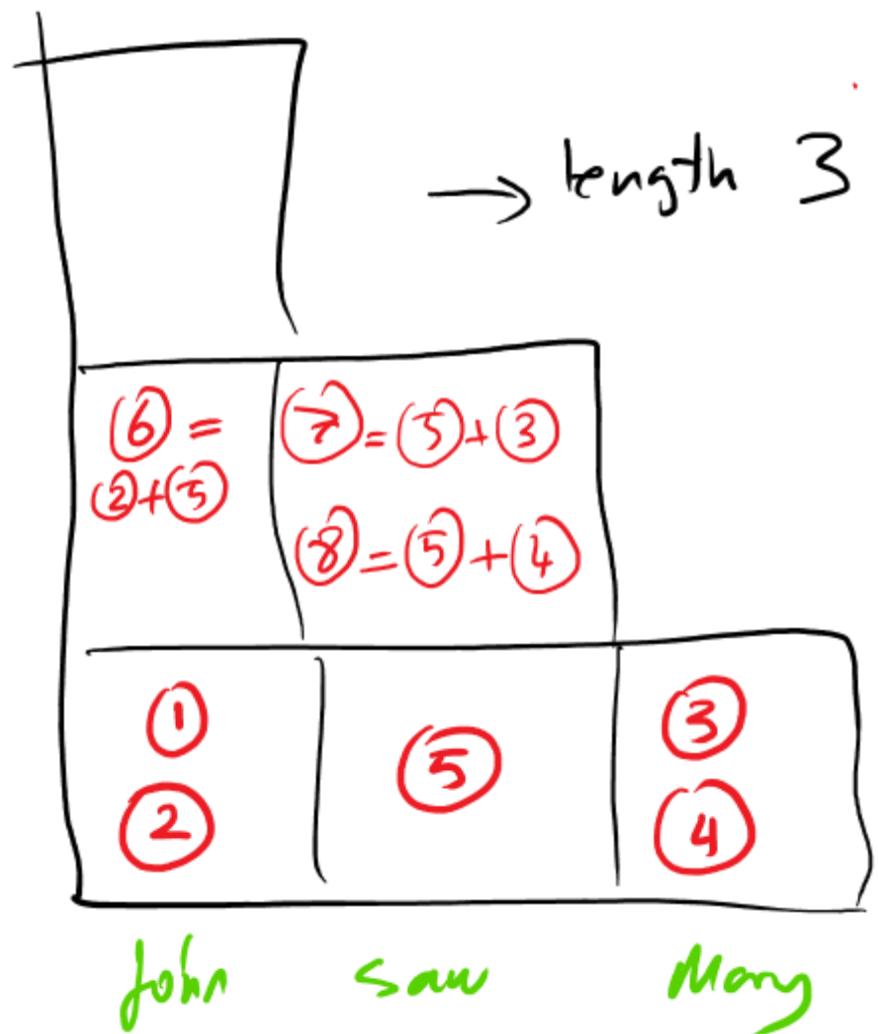
Composition is:

← how do we get that?

$$\lambda z. (\lambda p. p J') [(\lambda x. \lambda y. see' xy) z] =$$

$$\lambda z. (\lambda p. p J') [ \lambda y. see' z y ] = \lambda z. (\lambda y. see' z y) J'$$





"Rules":  $\boxed{X/Y:f \quad Y:a \rightarrow X:fa}$

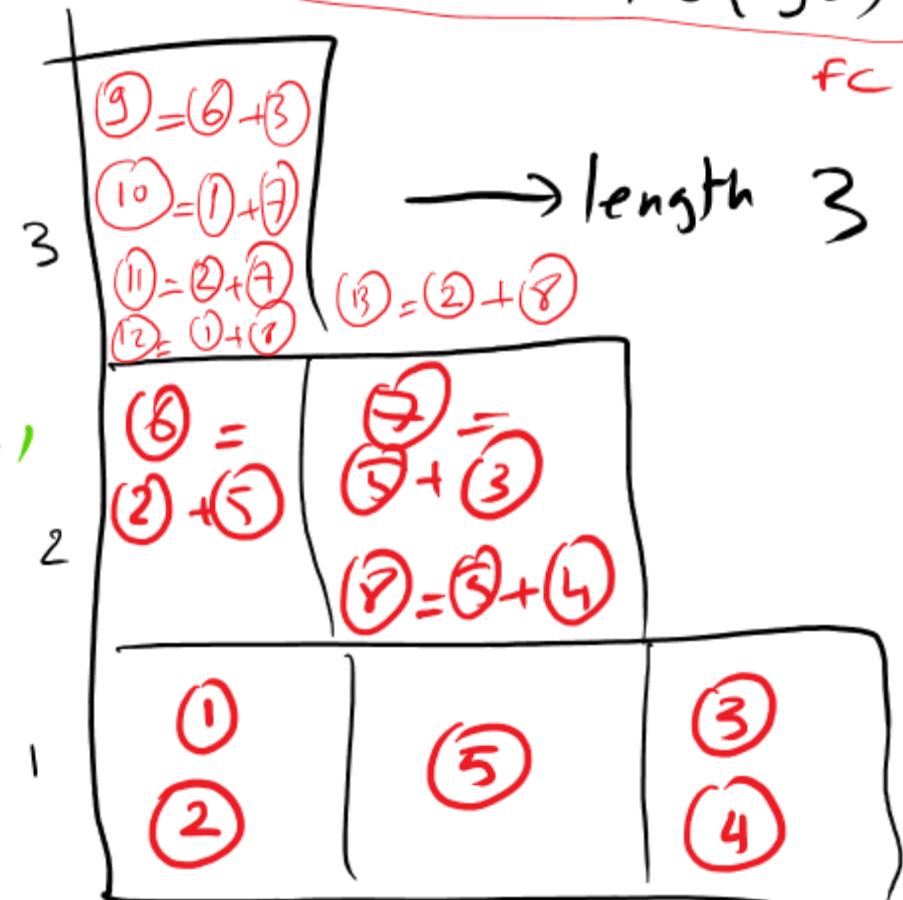
$\boxed{Y:a \quad X/Y:f \rightarrow X:fa}$

$X/Y:f \quad Y/Z:g$   
 $\rightarrow X/Z:$   
 $\pi_Z f(gZ)$

John :: NP: J' ①  
 :: S/(S\NP): NP.P J' ②

Many :: NP:m' ③  
 :: (S\NP)\((S\NP)\NP): NP.P J' ④

Saw :: (S\NP)\NP:  $\lambda x \lambda y. \text{see}' x y$  ⑤



FA: forward application FC: forward composition  
 BA: backward "

john saw many

for example,

$$② = ① + ⑦ = \text{NP: } \bar{J}' \quad \text{S(np: } \lambda x. \text{see}^m x)$$

$\xrightarrow{\text{SA}}$  S: see<sup>m</sup> J'

$$④ = ② + ⑦ = S/(S \setminus \text{NP}): \lambda p. p \bar{J}' \quad \text{S(np: } \lambda x. \text{see}^m x)$$

$\xrightarrow{\text{FA}}$  S: see<sup>m</sup> J'

$$\begin{aligned} & (\lambda p. p \bar{J}') (\lambda x. \text{see}^m x) \\ &= (\lambda x. \text{see}^m x) \bar{J}' = \text{see}^m \bar{J}' \end{aligned}$$

- CKY produces a PARSE FOREST. (all results)
- All binary combinations can be read off the CKY matrix. (dynamic programming)
- It is ONE MODEL of mechanics of linguistic analysis:
  - Bottom-up parsing

Analysis is a theoretical concept.

Combination and decomposition are MODELING concepts)

- Parsers can solve mechanical aspects of who does what to whom,  
GIVEN category choice!!

- They are objects of modeling, NOT  
objects of grammar.