

# LING/C SC 581:

## Advanced Computational Linguistics

Lecture 7

# Today's Topic

- *Leaving the topic of context-sensitive languages*
- Turn to writing our own CFGs for natural language:
  1. *agreement* in natural language
  2. the problem with Prolog & left recursion
  3. a grammar transformation:
    - left recursive to right recursive **BUT structure preserving**
- *Homework 4 (note deadline)*

# nl1.prolog

- Example (nl1.prolog):

1. s --> np, vp.
2. np --> det, nn.
3. det --> [the] | [a].
4. nn --> [man] | [ball].
5. vp --> vtr, np.
6. vtr --> [kicked] | [hit].

```
?- [nl1].  
true.  
?- s([the,man,kicked,the,ball], []).  
true ;  
false.  
?- s([the,man,kicked,the,ball,into,touch], List).  
List = [into, touch] ;  
false.
```

# nl1.prolog

- Enumerate the language:

```
?- s(List, []).  
List = [the, man, kicked, the, man] ;  
List = [the, man, kicked, the, ball] ;  
List = [the, man, kicked, a, man] ;  
List = [the, man, kicked, a, ball] ;  
List = [the, man, hit, the, man] ;  
List = [the, man, hit, the, ball] ;  
List = [the, man, hit, a, man] ;  
List = [the, man, hit, a, ball] ;  
List = [the, ball, kicked, the, man] ;  
List = [the, ball, kicked, the, ball] ;  
List = [the, ball, kicked, a, man] ;  
List = [the, ball, kicked, a, ball] ;  
List = [the, ball, hit, the, man] ;  
List = [the, ball, hit, the, ball] ;  
List = [the, ball, hit, a, man] ;  
List = [the, ball, hit, a, ball] ;
```

```
List = [a, man, kicked, the, man] ;  
List = [a, man, kicked, the, ball] ;  
List = [a, man, kicked, a, man] ;  
List = [a, man, kicked, a, ball] ;  
List = [a, man, hit, the, man] ;  
List = [a, man, hit, the, ball] ;  
List = [a, man, hit, a, man] ;  
List = [a, man, hit, a, ball] ;  
List = [a, ball, kicked, the, man] ;  
List = [a, ball, kicked, the, ball] ;  
List = [a, ball, kicked, a, man] ;  
List = [a, ball, kicked, a, ball] ;  
List = [a, ball, hit, the, man] ;  
List = [a, ball, hit, the, ball] ;  
List = [a, ball, hit, a, man] ;  
List = [a, ball, hit, a, ball].
```

# nl2.prolog

- **Recovering a parse tree**

- we use a term data structure for the tree
- simple transformation: adding an extra argument to **all** nonterminals

- Example (nl2.prolog):

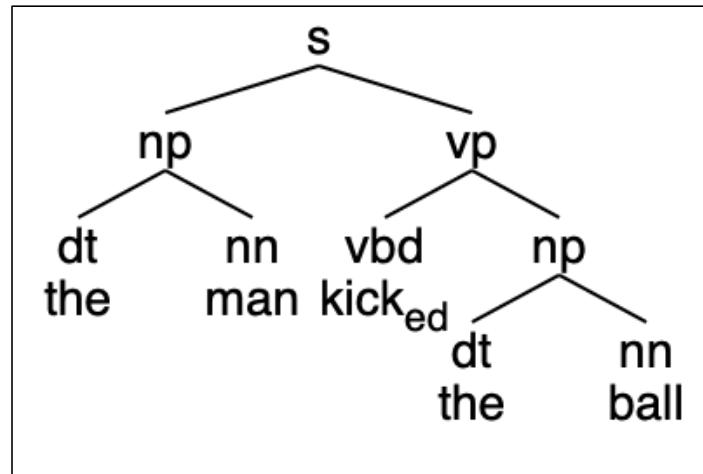
1.  $s(s(NP, VP)) \rightarrow np(NP), vp(VP).$
2.  $np(np(DET, NN)) \rightarrow det(DET), nn(NN).$
3.  $det(dt(the)) \rightarrow [the].$
4.  $det(dt(a)) \rightarrow [a].$
5.  $nn(nn(man)) \rightarrow [man].$
6.  $nn(nn(ball)) \rightarrow [ball].$
7.  $vp(vp(VTR, NP)) \rightarrow vtr(VTR), np(NP).$
8.  $vtr(vbd(kick_ed)) \rightarrow [kicked].$
9.  $vtr(vbd(hit_ed)) \rightarrow [hit].$

Basic transformation:  
 $x \rightarrow y, z.$   
 $x(x(Y, Z)) \rightarrow y(Y), z(Z).$

*Note: I can return any term I like*

# nl2.prolog

- Example:  
?- [nl2].  
**true.**



?- s(**Parse**, [the, man, kicked, the, ball], []).  
Parse = s(np(dt(the)), nn(man)), vp(vbd(kick\_ed), np(dt(the), nn(ball))).

# SWISH <https://swish.swi-prolog.org>

The screenshot shows the SWISH web-based Prolog environment. The top navigation bar includes links for File, Edit, Examples, Help, Search, and a user icon. A toolbar on the right features icons for Google, RSS, and a red notification badge.

In the main area, there are two tabs: "Program" (selected) and "+". The "Program" tab contains the following Prolog code:

```
1 :- use_rendering(svgtree, [list(false)]).
2 s(s(NP, VP)) --> np(NP), vp(VP).
3 np(np(DET, NN)) --> det(DET), nn(NN).
4 det(dt(the)) --> [the].
5 det(dt(a)) --> [a].
6 nn(nn(man)) --> [man].
7 nn(nn(ball)) --> [ball].
8 vp(vp(VTR, NP)) --> vtr(VTR), np(NP).
9 vtr(vbd(kick_ed)) --> [kicked].
10 vtr(vbd(hit_ed)) --> [hit].
```

The "+ tab" displays a parse tree for the sentence "the man kicked the ball". The tree structure is as follows:

```
Parse = s
      +-- np
      |   +-- dt: the
      |   +-- nn: man
      +-- vp
          +-- vbd: kicked
          +-- np
              +-- dt: the
              +-- nn: ball
```

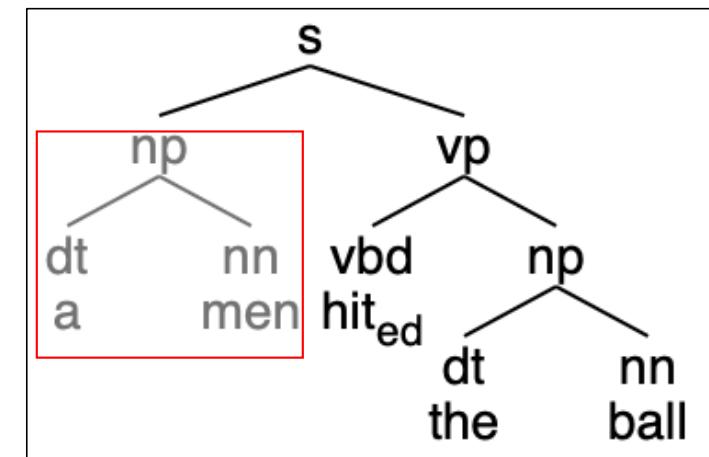
Below the tree, a query window shows the command:

```
?- s(Parse, [the,man,kicked,the,ball], []).
```

At the bottom of the interface are buttons for Examples, History, Solutions, a checkbox for "table results", and a "Run!" button.

# Extra Arguments: Agreement

- Idea:
  - We can also use an extra argument to impose constraints between constituents within a DCG rule
- Example:
  - English number agreement between DT and NN
  - Data:
    - the man              the men
    - a man              **\*a men**
  - Lexical Features (Number):
    - *man* value singular (sg)
    - *men* value plural (pl)
    - *the* value singular or plural (sg/pl)
    - *a* value singular (sg)



\* means *ungrammatical*

# Extra Arguments: Agreement

- Example (`nl3.prolog`):

1. `s(s(NP, VP)) --> np(NP), vp(VP).`
2. `np(np(DET, NN)) --> det(DET, NUM), nn(NN, NUM).`
3. `det(dt(the), sg) --> [the].`
4. `det(dt(the), pl) --> [the].`
5. `det(dt(a), sg) --> [a].`
6. `nn(nn(man), sg) --> [man].`
7. `nn(nn(men), pl) --> [men].`
8. `nn(nn(ball), sg) --> [ball].`
9. `vp(vp(VTR, NP)) --> vtr(VTR), np(NP).`
10. `vtr(vbd(kick_ed)) --> [kicked].`
11. `vtr(vbd(hit_ed)) --> [hit].`

# Extra Arguments: Agreement

## Note:

- Use of the extra argument NUM for agreement here is basically “syntactic sugar” and **lends no more expressive power** to the grammar rule system
- i.e. *we can enforce agreement without the use of the extra argument at the cost of writing more rules*

• Instead of  
np(np(DET, NN)) --> det(DET, **NUM**), nn(NN, **NUM**).  
we could have encoded NUM into the nonterminal name:

np(np(DET, NN)) --> det\_sg(DET), nn\_sg(NN).

np(np(DET, NN)) --> det\_pl(DET), nn\_pl(NN).

det\_sg(dt(the)) --> [the].

det\_pl(dt(the)) --> [the].

det\_sg(dt(a)) --> [a].

nn\_sg(nn(man)) --> [man].

nn\_pl(nn(men)) --> [men].

nn\_sg(nn(ball)) --> [ball].

nl4.prolog

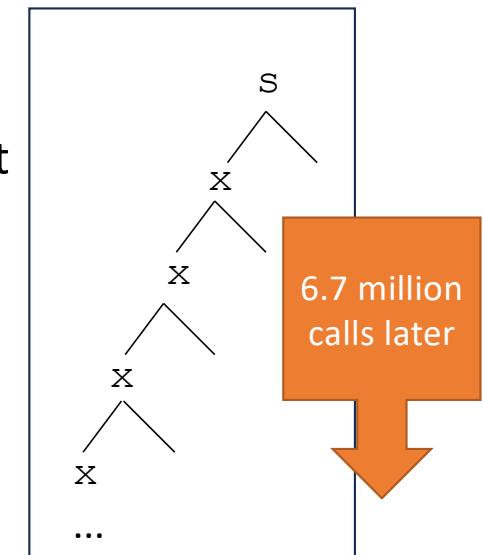
# Left recursion and Prolog grammars

Left recursive grammars:

- given Prolog's **left-to-right depth-first computation rule**, left recursive rules are a *no-no* ...
- Example (`left.prolog`):

1. `s --> x, y.`
2. `x --> x, [a].`
3. `x --> [a].`
4. `y --> [b].`

rule for nonterminal x  
immediately calls x again!



```
[?- s([a,b], []).  
ERROR: Stack limit (1.0Gb) exceeded  
ERROR:  Stack sizes: local: 1.0Gb, global: 35Kb, trail: 1Kb  
ERROR:  Stack depth: 6,710,067, last-call: 0%, Choice points: 6,710,059  
ERROR:  Probable infinite recursion (cycle):  
ERROR:    [6,710,067] user:x([length:2], _9240)  
ERROR:    [6,710,066] user:x([length:2], _9266)  
Exception: (6,705,641) x([a, b], _9456) ?
```

# Left recursion and Prolog grammars

- Example (`left.prolog`):

```
1. s --> x, y.  
2. x --> x, [a].  
3. x --> [a].  
4. y --> [b].
```

- An idea (*swap rules 2 and 3*):

```
1. s --> x, y.  
2. x --> [a].  
3. x --> x, [a].  
4. y --> [b].
```

; eventually  
calls for  
stacking rule 3.  
*12 million deep*

- (`left2.prolog`)

```
[?- [left2].  
true.  
  
[?- s([a,b], []).  
true ;
```

```
[?- s([a,b], []).  
true ;  
ERROR: Stack limit (1.0Gb) exceeded  
ERROR: Stack sizes: local: 1.0Gb, global: 25Kb, trail: 0Kb  
ERROR: Stack depth: 12,200,438, last-call: 0%, Choice points: 3  
ERROR: Probable infinite recursion (cycle):  
ERROR: [12,200,438] user:x([length:2], _6582)  
ERROR: [12,200,437] user:x([length:2], _6608)
```

# Big picture question

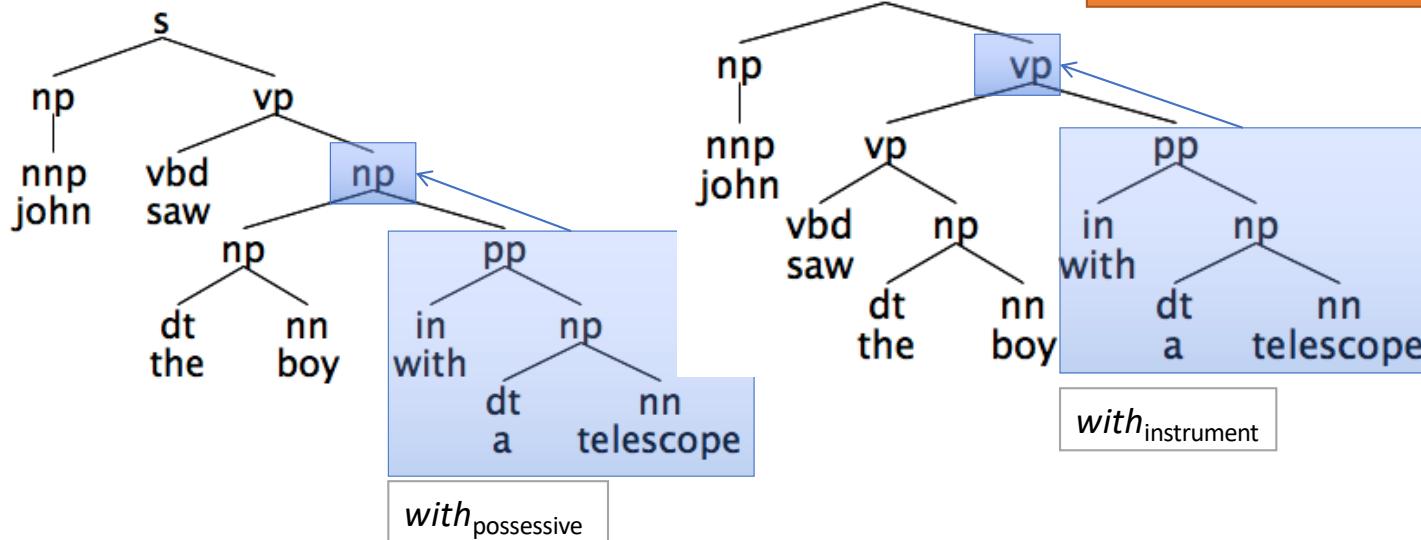
- Is this just a theoretical problem: i.e. not a problem for natural language grammars?
- Unfortunately it is a problem ...
  - *John saw the boy with a telescope*
  - is structurally ambiguous wrt. attachment of the PP *with a telescope*
  - (PP = prepositional phrase)

# Preposition Phrase (PP) Attachment

- The preferred syntactic analysis is a left recursive parse
- Example:

- *John saw the boy with a telescope*

Rules are:  
 $\text{vp} \rightarrow \text{vp}, \text{pp}$ .  
 $\text{np} \rightarrow \text{np}, \text{pp}$ .



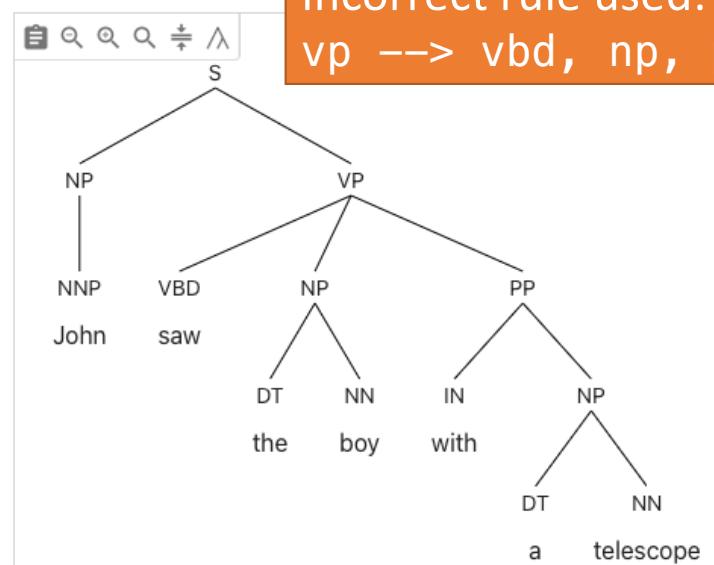
# Preposition Phrase (PP) Attachment

<https://parser.kitaev.io>

Sentence:

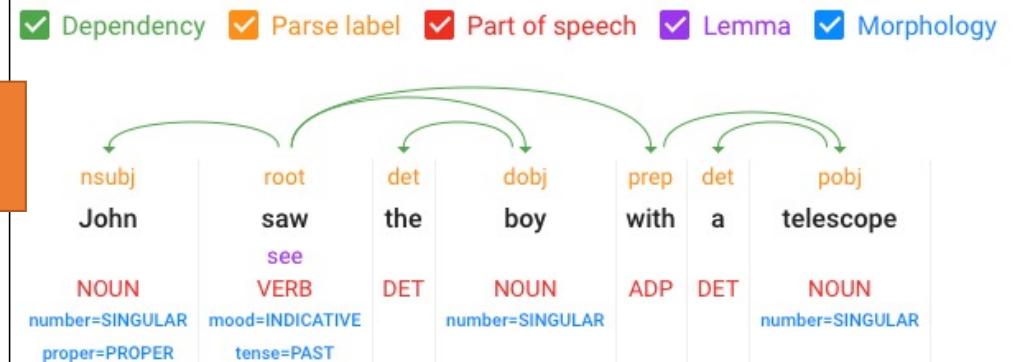
John saw the boy with a telescope

Parse tree:



Incorrect rule used:  
vp --> vbd, np, pp.

<https://cloud.google.com/natural-language>



dependency parse (*essentially same problem*):  
root is *saw*  
root --> prep  
root --> dobj.

# nl5.prolog

## Live programming

- Let's add to nl3.prolog so we can parse:
  - *John saw the boy with a telescope*
- Need to add:
  - verb (VBD): *saw – past tense (-ed)*
  - preposition (IN): *with*
  - singular nouns (NN): *telescope, boy, limp*
  - proper noun (NNP): *john ('John'), mary – initial caps = variable*
- Need to add:
  - PP attachment to NP and VP rules

## Penn Part-of-Speech (POS)Tagset

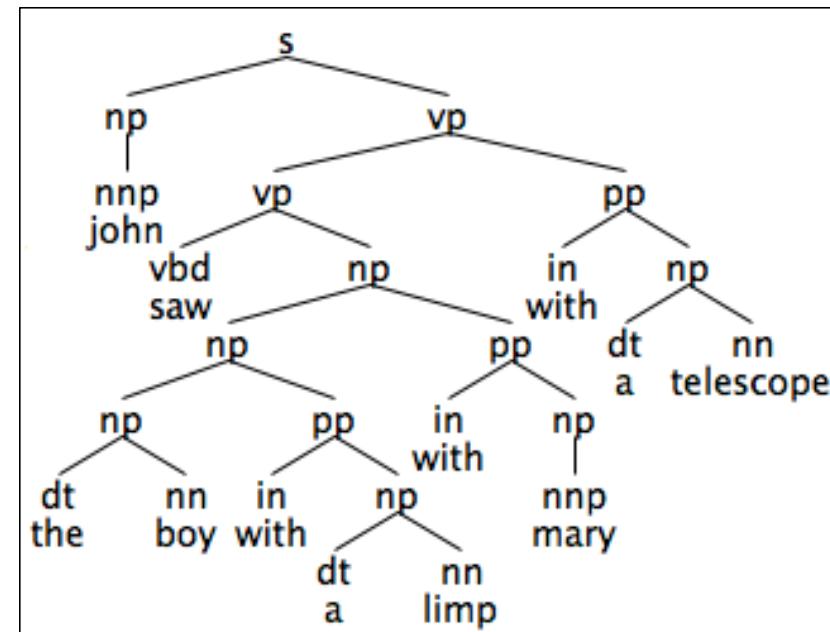
| Tag | Description                   | Example             | Tag   | Description        | Example            | Tag  | Description               | Example            |
|-----|-------------------------------|---------------------|-------|--------------------|--------------------|------|---------------------------|--------------------|
| CC  | coord. conj.                  | <i>and, but, or</i> | NNP   | proper noun, sing. | <i>IBM</i>         | TO   | "to"                      | <i>to</i>          |
| CD  | cardinal number               | <i>one, two</i>     | NNPS  | proper noun, plu.  | <i>Carolinas</i>   | UH   | interjection              | <i>ah, oops</i>    |
| DT  | determiner                    | <i>a, the</i>       | NNS   | noun, plural       | <i>llamas</i>      | VB   | verb base                 | <i>eat</i>         |
| EX  | existential 'there'           | <i>there</i>        | PDT   | predeterminer      | <i>all, both</i>   | VBD  | verb past tense           | <i>ate</i>         |
| FW  | foreign word                  | <i>mea culpa</i>    | POS   | possessive ending  | <i>'s</i>          | VBG  | verb gerund               | <i>eating</i>      |
| IN  | preposition/<br>subordin-conj | <i>of, in, by</i>   | PRP   | personal pronoun   | <i>I, you, he</i>  | VBN  | verb past partici-<br>ple | <i>eaten</i>       |
| JJ  | adjective                     | <i>yellow</i>       | PRP\$ | possess. pronoun   | <i>your, one's</i> | VBP  | verb non-3sg-pr           | <i>eat</i>         |
| JJR | comparative adj               | <i>bigger</i>       | RB    | adverb             | <i>quickly</i>     | VBZ  | verb 3sg pres             | <i>eats</i>        |
| JJS | superlative adj               | <i>wildest</i>      | RBR   | comparative adv    | <i>faster</i>      | WDT  | wh-determ.                | <i>which, that</i> |
| LS  | list item marker              | <i>1, 2, One</i>    | RBS   | superlatv. adv     | <i>fastest</i>     | WP   | wh-pronoun                | <i>what, who</i>   |
| MD  | modal                         | <i>can, should</i>  | RP    | particle           | <i>up, off</i>     | WP\$ | wh-possess.               | <i>whose</i>       |
| NN  | sing or mass noun             | <i>llama</i>        | SYM   | symbol             | <i>+,%,&amp;</i>   | WRB  | wh-adverb                 | <i>how, where</i>  |

**Figure 8.2** Penn Treebank part-of-speech tags.

Jurafsky & Martin ed3. draft

# Preposition Phrase (PP) Attachment

- The preferred syntactic analysis is a left recursive parse
  - notice we can “stack” the PPs, as in:
  - *John saw the boy with a limp with Mary with a telescope*
  - *with*-ambiguity:
    - *with*<sub>possessive</sub>,
    - *with*<sub>accompaniment</sub>,
    - *with*<sub>instrument</sub>



# Preposition Phrase Attachment

- Linguistically:
  - PP (recursively) adjoins to NP or VP
  - $\text{np}(\text{np}(\text{NP}, \text{PP})) \rightarrow \text{np}(\text{NP}), \text{pp}(\text{PP})$ .
  - $\text{vp}(\text{vp}(\text{VP}, \text{PP})) \rightarrow \text{vp}(\text{VP}), \text{pp}(\text{PP})$ .
- Left recursion gives Prolog problems
- Derivation (top-down, left-to-right):
  1. vp
  2. vp pp
  3. vp pp pp
  4. vp pp pp pp
  5. vp pp pp pp pp *infinite loop...*

**Note:**

only the parse tree argument shown here  
*other extra arguments are possible*

# Transformation

- Apply the general left to right recursive transformation:

$x(x(X,y)) \rightarrow x(X), [y].$   
 $x(x(z)) \rightarrow [z].$



$x(X) \rightarrow [z], w(X,x(z)).$   
 $x(x(z)) \rightarrow [z].$   
 $w(W,X) \rightarrow [y], w(W,x(X,y)).$   
 $w(x(X,y),X) \rightarrow [y].$

**Note:**  
w is a *fresh* nonterminal that takes 2 arguments

- to the NP rules:

1.  $\underline{np(np(DT,NN))} \rightarrow dt(DT,Number), [z]nn(NN,Number).$

2.  $\underline{np(np(NP,PP))} \rightarrow np(NP), \underline{pp(PP)}.$

$x$                              $[y]$

x is the recursive nonterminal

# Transformation

- Consider input strings:

1. [z]
2. [z, y]
3. [z, y<sub>1</sub>, y<sub>2</sub>]

1.  $x(x(X, y)) \rightarrow x(X), [y].$   
 2.  $x(x(z)) \rightarrow [z].$

Parse:

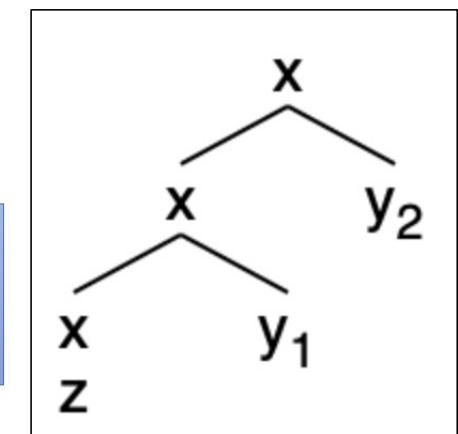
- $x(z)$
- $x(x(z), y)$
- $x(x(x(z), y_1), y_2)$

Transformed rules:

- 2
- 1 + 4
- 1 + 3 + 4



1.  $x(X) \rightarrow [z], w(X, x(z)).$
2.  $x(x(z)) \rightarrow [z].$
3.  $w(W, X) \rightarrow [y], w(W, x(X, y)).$
4.  $w(x(X, y), X) \rightarrow [y].$



Steps for example 3:

- [z, ●y<sub>1</sub>, y<sub>2</sub>] rule 1: call nonterminal  $w(X, x(z))$   
 [z, y<sub>1</sub>, ●y<sub>2</sub>] rule 3: call nonterminal  $w(X, x(x(z), y_1))$   
 [z, y<sub>1</sub>, y<sub>2</sub>●] rule 4: answer  $X = x(x(x(z), y_1), y_2)$

the left recursive structure  
formed by a right recursive  
parse of [z, y<sub>1</sub>, y<sub>2</sub>]

# Homework 4

- Q1: apply the transformation to the left recursion in `n15.prolog`:
  - `np(np(NP,PP)) --> np(NP), pp(PP).`
  - `vp(vp(VP,PP)) --> vp(VP), pp(PP).`
- Show your grammar working properly on example sentences:
  1. the boy saw the man with the telescope
  2. the boy with the telescope saw the man
  3. the boy kicked the man with the telescope
  4. the boy with the telescope kicked the man
  5. the boy with the telescope kicked the man with the limp
- Show all possible parses (;) until **false** in each case
- Q2: suggest a way to limit **overgeneration** (*no need to implement*)

# Homework 4

- Hint #1: consider the case when there are multiple base rules for  $x$
- $x(x(X, y)) \rightarrow x(X), [y].$
- $x(x(z)) \rightarrow [z].$
- $x(x(w)) \rightarrow [w].$
- Hint #2:  $w$  must be a fresh nonterminal, i.e. cannot be shared between the NP and VP recursions. Why?
- You can ask questions about the homework in class Tuesday

# Homework 4

- Submit to [sandiway@arizona.edu](mailto:sandiway@arizona.edu)
- SUBJECT: 581 Homework 4 ***YOUR NAME***
- One PDF file (for grading)
  - include your grammar code and SWI-Prolog screenshots in your answer
- Attach (if I need to run your code):
  - source code for your grammar
- Deadline:
  - midnight Wednesday (*assume HW needs more time*)
  - we will review the homework on Thursday