

# Computational Psycholinguistics

## Lecture 3: Parsing and Memory



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## Overview

- Computational psycholinguistics
  - Models of how people use linguistic knowledge to process language
    - + Grammaticality: possibly including degrees of acceptability
    - + Complexity: when sentences are too complex
    - + Behaviour: preferences in resolving ambiguity and reanalysis
- Computational models provide the framework for examining the characteristics and predictions of particular theories.
- Implementing Parsers in Prolog
  - Top-down
  - Shift-reduce (bottom-up)
- Implementing Left-corner parsers in Prolog:
  - Arc-standard
  - Arc Eager
- Profiling memory requirements for embeddings

## Memory Load in Parsing

- Left-embedding (LE) is easy:
  - [[[John's brother]'s car door]'s handle] broke off.
- So is right-embedding (RE):
  - John believes [Bill knows [Mary said [she likes cats]]]
- But centre-embedding (CE) is hard:
  - [The mouse [the cat [the dog bit] chased] died]
- Top-down: LE: hard CE: hard RE: easy
- Bottom-up: LE: easy CE: hard RE: hard
- Left-corner: LE: easy CE: hard RE: easy

## Grammars as Programs

- So, for a grammar like:

```
s --> np, vp.
np --> det, n.
vp --> v, np, np.
vp --> v.
det --> [ the] .          det --> [ a] .
n --> [ man] .           n --> [ woman] .
v --> [ gave] .   v --> [ swims] .
```
- In Prolog:

```
s(A,B) :- np(A,C), vp(C,B).
np(A,B) :- det(A,C), n(C,B).
vp(A,B) :- v(A,C), np(C,D), np(D,B).
det(A,B) :- 'C' (A,the,B).
'C' ([ Head|Tail],Head,Tail).
```

## Grammars as Data

### ■ Writing an parser

- write a parser which takes a grammar and string as it's input
- Since '-->' converts a rule into a Prolog clause, use a new operator: '---->'

### ■ So, for a grammar like:

```
:- op(1100, xfx, '---->').
s ----> np, vp.
np ----> det, n.
vp ----> v, np.
vp ----> v.
det ----> [ the] . det ----> [ a] .
n ----> [ man] . n ----> [ woman] .
v ----> [ gave] . v ----> [ swims] .
```

## A Top-Down Parser in Prolog

```
% Expand the current NT using a rule
td_parse(NT, P0, P) :-
    (NT ----> Body),
    td_parse(Body, P0, P).

% Parse each of the symbols on the RHS
td_parse((Body1, Body2), P0, P) :-
    td_parse(Body1, P0, P1),
    td_parse(Body2, P1, P).

% Consume a word in the input
td_parse([ Word] , P0, P) :-
    connects(P0, Word, P).

% Difference list handling
connects([ Word|List] , Word, List) .
```

## The Shift-Reduce Parser in Prolog

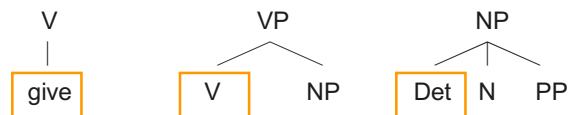
```
% Done
parse([ s] ,[] ) .

% Reduce
parse([ Y,X|Rest] ,String) :-
    (LHS ---> X,Y) ,
    parse([ LHS|Rest] ,String) .

% Shift
parse(Stack,[ Word|Rest] ) :-
    (Cat ---> [ Word] ) ,
    parse([ Cat|Stack] ,Rest) .
```

## A Psychologically Plausible Parser

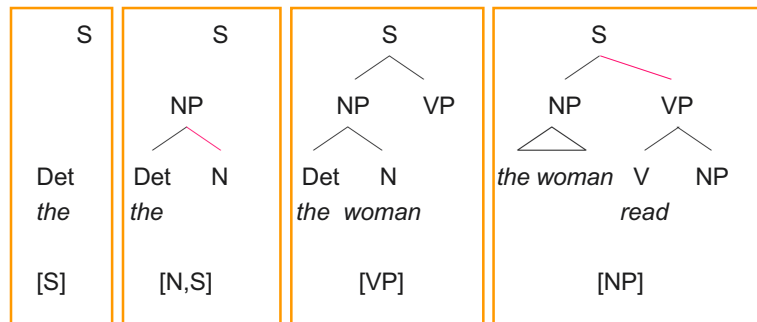
- Left-Corner Parsing
- Rules are 'activated' by their 'left-corner'



- Combines input-driven with top-down
- There is a 'class' of LC parsers

## An example LC parse

### ■ “The woman read the book”



### ■ Is this incremental?

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## A Grammar

```
:- op(1100,xfx, '--->').
```

```
s ---> np, vp.  
np ---> det, n.  
np ---> np, rc.  
rc ---> rpro, sgap.  
sgap ---> np, vt.  
vp ---> vt, np.  
vp ---> vs, s.  
...  
det ---> [ the] .  
N ---> [ cat] .  
vt ---> [ chased] .  
vs ---> [ knows] .  
...
```

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## Left-Corner Parsing in Prolog

```
parse(Phrase,S1,S0) :-  
    connects(S1,Word,S2),  
    (Cat ---> [Word]),  
    lc(Cat,Phrase,S2,S1).  
  
% Reflexive closure  
lc(Phrase,Phrase,S0,S0).  
  
% Transitive closure  
lc(SubPhrase,SuperP,S1,S0) :-  
    (Phrase ---> SubPhrase, Right),  
    parse(Right,S1,S2),  
    lc(Phrase,SuperP,S2,S0).  
  
% Difference list handling  
connects([Word|List],Word,List).
```

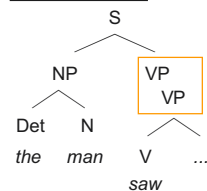
## Evaluating the LC Parser

### ■ Almost incremental

### ■ Variations:

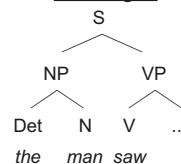
- ☐ Using a 'top-down' oracle of LC relation

#### ☐ Arc-standard



versus

#### arc-eager



### ■ Affect on ambiguity resolution for arc-eager:

- ☐ Commitment to attachments is early (before constituents are complete)
- ☐ Top-down use of syntactic context

### ■ Possible left-recursion problems

## Using an Oracle

- The left-corner relation holds for only a finite pair of categories.

```
% Grammar
s ---> np, vp.
np ---> det, n.
det ---> np, poss.
vp ---> v, np.

% Oracle: reflexive, transitive closure.
link(s,s).    link(np,s).    link(np,np).
link(n,n).    link(det,s).   link(v,vp).
link(det,np). link(vp,vp).
link(det, det).
```

## Left-Corner Parsing with Oracle

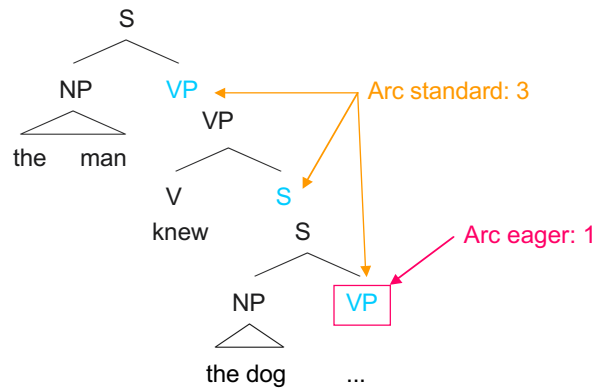
```
parse(Phrase, S1, S0) :-
    connects(S1, Word, S2),
    (Cat ---> [ Word] ),
    link(Cat, Phrase),
    lc(Cat, Phrase, S2, S1).

% Reflexive closure
lc(Phrase, Phrase, S0, S0).

% Transitive closure
lc(SubPhrase, SuperP, S1, S0) :-
    (Phrase ---> SubPhrase, Right),
    link(SubPhrase, SuperP),
    parse(Right, S1, S2),
    lc(Phrase, SuperP, S2, S0).
```

## Evaluating the LC Parser

- “Quite” incremental
- Variations:
  - Using a ‘top-down’ oracle of LC relation
  - Arc-standard versus Arc-eager



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## Eager Left-Corner Parsing

```
% Reflexive closure
lc(Phrase, Phrase, S0, S0) .

% Eager composition
lc(Phrase, SuperP, S1, S0) :-
    (SuperP ---> Phrase, Right),
    parse(Right, S1, S0) .

% Transitive closure
lc(SubPhrase, SuperP, S1, S0) :-
    (Phrase ---> SubPhrase, Right),
    parse(Right, S1, S2),
    lc(Phrase, SuperP, S2, S0) .
```

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## Summary of Behaviour

Node	Arcs	Left	Centre	Right
Top-down	Either	$O(n)$	$O(n)$	$O(1)$
Shift-reduce	Either	$O(1)$	$O(n)$	$O(n)$
Left-corner	Standard	$O(1)$	$O(n)$	$O(n)$
Left-corner	Eager	$O(1)$	$O(n)$	$O(1)$
People		$O(1)$	$O(n)$	$O(1)$

## Comments on Left-Corner

- Mixed data-driven and hypothesis driven approaches
- An oracle can increase the top-down component, reduce ambiguity
- Composition:
  - Eager parsing corresponds to *composition of partial structures*
  - Combinatory categorial grammar (CCG) directly incorporates such composition into the grammar formalism.
- Trade-off:
  - Arc Standard: less ambiguity
    - + attachments are made when constituents are complete: safer
    - + delayed attachment means more must be kept on the stack
  - Arc Eager: less memory
    - + early composition reduces memory for the push-down automata
    - + eager attachments are made with less bottom-up evidence

## Parsing and ambiguity resolution

---

- We can motivate the LC-eager parser in term of memory requirements
- What predictions does it make for ambiguity resolution?
  
- Consider the following high-low attachment ambiguity:
  - “Two sisters reunited after eighteen years in a checkout counter”
  - “John said that he will go to Edinburgh last week”
- These sentence are perceived as odd, because people prefer to attach the modifier “low” (to the immediately preceding phrase), but it must be attached “high” (to the main verb)
  
- Extending the computational model:
  - What attachment is preferred by the parsers discussed here?
  - Does the choice of grammar make a difference?
  - Is there some what to implement this “low attachment” preference in the parsers discussed?