

# Computing Dynamic Meanings

Day 2: Introduction to syntactic and semantic parsing in  
*ACT-R/pyactr*

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# Topic for today

- Parsing
- Is interpretation incremental?

Altmann and Steedman, 1988; Marslen-Wilson, 1973, 1975; Tanenhaus et al., 1995; Trueswell et al., 1994

- If so, what does it tell us about (syntactic) parsing?  
Steedman, Stabler, Shieber & Johnson

# Syntactic parsers are incremental

Garden-path or “garden-path-like” effects :

- (1)    a.    The horse raced past the barn fell.
- b.    The horse that was raced past the barn fell.

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- (2)    Trump urged to stop tweeting on Trump tower meeting.
- (3)    a.    While she mended a sock fell on the floor.  
       b.    While she mended, a sock fell on the floor.

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Garden-path or “garden-path-like” effects :

- (1)   a.   The horse raced past the barn fell.  
      b.   The horse that was raced past the barn fell.
- (2)   Trump urged to stop tweeting on Trump tower meeting.
- (3)   a.   While she mended a sock fell on the floor.  
      b.   While she mended, a sock fell on the floor.
- (4)   a.   The professor saw the students walked across the quad.  
      b.   The professor saw that the students walked across the quad.

# Syntactic parsers are incremental

Garden-path or “garden-path-like” effects :

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- (2)    Trump urged to stop tweeting on Trump tower meeting.
- (3)    a.    While she mended a sock fell on the floor.  
       b.    While she mended, a sock fell on the floor.
- (4)    a.    The professor saw the students walked across the quad.  
       b.    The professor saw that the students walked across the quad.
- (5)    a.    Put the apple on the towel into the box.  
       b.    Put the apple that is on the towel into the box.

# Syntactic parsers are incremental

Garden-path or “garden-path-like” effects :

- I. The horse raced past the barn fell.
- II. While she mended a sock fell on the floor.
- III. The professor saw the students walked across the quad.
- IV. Put the apple on the towel into the box.

→ syntactic parsing is incremental

## Terminology

- locally/temporarily ambiguous sentences
- garden-path sentences



## Marslen-Wilson (1975): shadowing

### **Normal sentence:**

- The new peace terms have been announced. They call for the unconditional withdrawal of all the enemy forces.

### **Semantically anomalous sentence:**

- The new peace terms have been announced. They call for the unconditional **universe** of all the enemy forces.

## Marslen-Wilson (1975): shadowing

The word *withdrawal/universe*: disrupted in one of the syllables, or not disrupted

- 2nd syllable: *withdrawal* → *withdewal*
- 3rd syllable: *withdrawal* → *withdrawack*
- 2nd syllable: *universe* → *unopverse*
- 3rd syllable: *universe* → *unitierse*

## Marslen-Wilson (1975): shadowing

- 2nd syllable: *withdrawal* → *withdewal*
- 3rd syllable: *withdrawal* → *withdrawack*
- Corrected often (27 cases)
- 2nd syllable: *universe* → *unopverse*
- 3rd syllable: *universe* → *unitierse*
- Hardly ever corrected (5 cases)

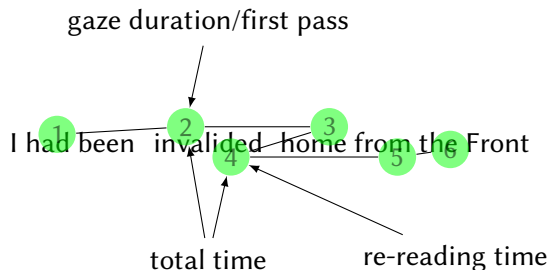
## Marslen-Wilson (1975): shadowing

### Item

*The new peace terms have been announced. They call for the unconditional withdrawal/universe of all the enemy forces.*

- Incremental interpretation, hence, restoration of disrupted words only in normal condition (in 2nd and 3rd syllables)
- Problems?

# Eye-tracking & 80's ad 90's



## Reduced-relative garden path

(6) The horse raced past the barn fell.

(7) The horse raced...

**Main-clause >> reduced-relative clause**

Minimal Attachment:

listeners/readers posit the smallest syntactic structures compatible with the input

Frazier, 1978

**Closely-similar alternatives:** J. Hale, 2011; Pritchett, 1988, 1992

**Other possibilities:** Bever, 1970; Gibson, 1991; J. Hale, 2001; Steedman, 2001

## Ferreira and Clifton, (1986)

### Interaction of semantic selectional restrictions and parsing

- (8) a. The defendant examined **by the lawyer** turned out to be unreliable. (Animate Reduced)
- b. The defendant that was examined **by the lawyer** turned out to be unreliable. (Animate Unreduced)

## Ferreira and Clifton, (1986)

### Interaction of semantic selectional restrictions and parsing

- (8) a. The defendant examined **by the lawyer** turned out to be unreliable. (Animate Reduced)  
b. The defendant that was examined **by the lawyer** turned out to be unreliable. (Animate Unreduced)
- (9) a. The evidence examined **by the lawyer** turned out to be unreliable. (Inanimate Reduced)  
b. The evidence that was examined **by the lawyer** turned out to be unreliable. (Inanimate Unreduced)



## Ferreira and Clifton, (1986)

- I. The Animate/Inanimate [<sub>V</sub> **examined**] [<sub>disamb</sub> **by the lawyer**]
- II. The Animate/Inanimate that was [<sub>V</sub> **examined**] [<sub>disamb</sub> **by the lawyer**]
  - First pass: Disamb – reduced slower than unreduced

## Ferreira and Clifton, (1986)

- I. The Animate/Inanimate [<sub>V</sub> **examined**] [<sub>disamb</sub> **by the lawyer**]
- II. The Animate/Inanimate that was [<sub>V</sub> **examined**] [<sub>disamb</sub> **by the lawyer**]

- First pass: Disamb – reduced slower than unreduced

⇒ incremental interpretation does not affect parsing

## Altmann and Steedman, (1988): NP/VP-attachment ambiguity

Context affects syntactic attachment

Target sentence:

(10) The burglar blew open the safe with...

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Context affects syntactic attachment

Target sentence:

- (10) The burglar blew open the safe with...
- a. ...the dynamite.
  - b. ...the new lock.

## Altmann and Steedman, (1988): NP/VP-attachment ambiguity

Context affects syntactic attachment

Target sentence:

- (10) The burglar blew open the safe with...
- a. ...the dynamite.
  - b. ...the new lock.
- (11)
- a. The burglar blew open [<sub>NP</sub> the safe with the N ]
  - b. The burglar [<sub>VP</sub> blew open [<sub>NP</sub> the safe ] with the N ]
- more than one safe → NP-attachment supported
  - just one safe → VP-attachment supported

## Altmann et al. (1988): context influence

### (12) NP-attachment support

- a. A burglar broke into a bank carrying some dynamite.  
He planned to blow up a safe.  
Once inside he saw that there was a safe which had a new lock and a **safe** which had an old lock.

### (13) VP-attachment support

- a. A burglar broke into a bank carrying some dynamite.  
He planned to blow up a safe.  
Once inside he saw that there was a safe which had a new lock and a **strongbox** which had an old lock.

## Altmann et al. (1988): context influence

### (12) NP-attachment support

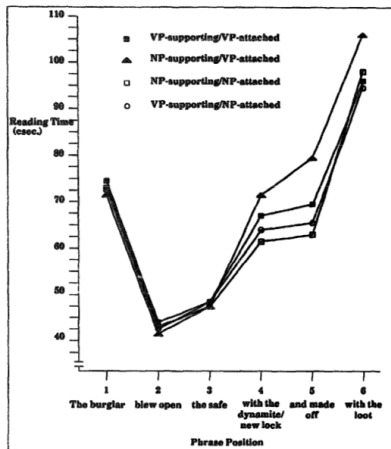
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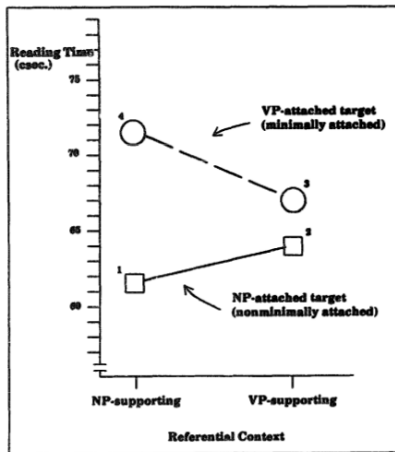
The burglar /blew open /the safe /**with the dynamite (new lock)**/and...

## Altmann et al. (1988): results





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# Altmann et al. (1988)

explanation of results

NP-attachment >> VP-attachment

Late Closure:

if more than one phrase is compatible with the phrase P, parser attaches P to the most local phrase currently being processed

Frazier (1978)

(14)     Jessie put the book Kathy was reading in the library...

# Altmann et al. (1988)

explanation of results

(NP-attachment >> VP-attachment) × context

Principle of Parsimony:

A reading that carries fewer unsatisfied presuppositions will be favored over one that carries more.

Steedman, 2001

(15) The burglar blew open the safe with the ...

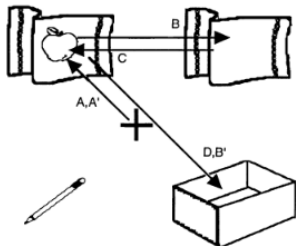
## Tanenhaus et al. (1995): visual context

- (16) Put the apple on the towel.
- a. Put [<sub>NP</sub> the apple on the towel ]
  - b. [<sub>VP</sub> Put [<sub>NP</sub> the apple ] on the towel ]

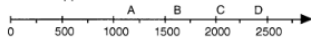
Experimental sentences:

- (17) Put the apple on the towel in the box. (Locally Ambiguous)
- (18) Put the apple that's on the towel in the box. (Locally Unambiguous)

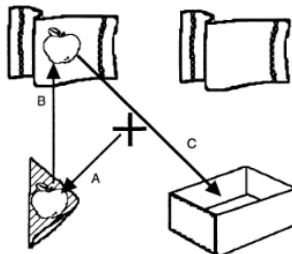
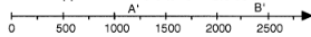
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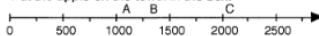
"Put the apple on the towel in the box."



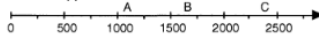
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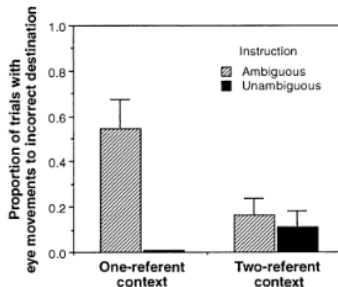
"Put the apple on the towel in the box."



"Put the apple that's on the towel in the box."



## Tanenhaus et al. (1995): visual context



**Fig. 3.** Proportion of trials in which participants looked at the incorrect destination.

- (19)      a.      Put the apple on the towel in the box.      (Ambiguous)  
             b.      Put the apple that's on the towel in the box.      (Unambiguous)

# Tanenhaus et al. (1995)

explanation of results

(NP-attachment >> VP-attachment) × context

Principle of Parsimony:

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(20) Put the apple on the towel in the box.

# Interim summary

- Semantic information available to parser
- Semantic constraints incrementally used  
Altmann and Steedman, 1988; Tanenhaus et al., 1995
- Semantic constraints not incrementally used  
Ferreira and Clifton, 1986



Trueswell et al. (1994)

## Interaction of semantic selectional restrictions and parsing

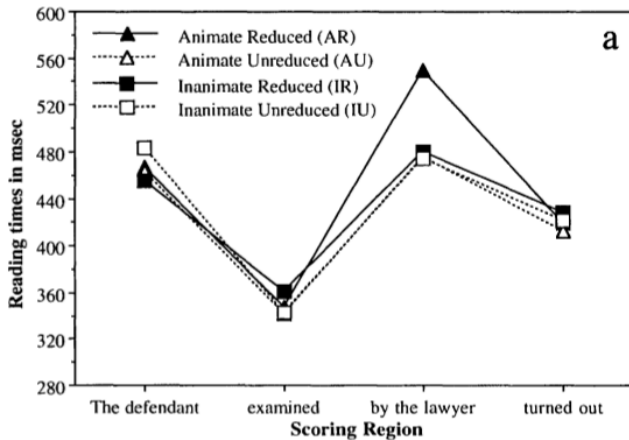
- (21) a. The defendant examined **by the lawyer** turned out to be unreliable. (Animate Reduced)
- b. The defendant that was examined **by the lawyer** turned out to be unreliable. (Animate Unreduced)

## Trueswell et al. (1994)

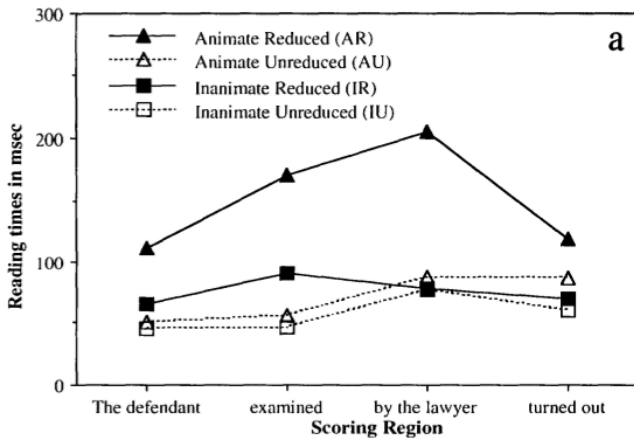
### Interaction of semantic selectional restrictions and parsing

- (21) a. The defendant examined **by the lawyer** turned out to be unreliable. (Animate Reduced)  
b. The defendant that was examined **by the lawyer** turned out to be unreliable. (Animate Unreduced)
- (22) a. The evidence examined **by the lawyer** turned out to be unreliable. (Inanimate Reduced)  
b. The evidence that was examined **by the lawyer** turned out to be unreliable. (Inanimate Unreduced)

## Trueswell et al. (1994):results



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# Eye-tracking & Trueswell et al. (1994)

## explanation of results

- Main-clause >> reduced-relative clause (if both possible)
- Parser uses lexical information (selectional restrictions) to change preferences
- But what about Ferreira and Clifton, 1986?
- Ferreira and Clifton, 1986 – inanimate condition not always violating selectional restrictions:

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## explanation of results

- Main-clause >> reduced-relative clause (if both possible)
- Parser uses lexical information (selectional restrictions) to change preferences
- But what about Ferreira and Clifton, 1986?
- Ferreira and Clifton, 1986 – inanimate condition not always violating selectional restrictions:  
The car towed from the parking lot...  
The meal brought to the highest priest...

# Summary

- Evidence that lexical and contextual semantics can guide parser in syntax

Altmann and Steedman, 1988; Marslen-Wilson, 1973, 1975; Tanenhaus et al., 1995; Trueswell et al., 1994

- Consequences?

Setting the stage

Theoretical considerations & parsing

Appendix: developments & refinements



# Theoretical considerations

- Semantics (compositionality principle)
- Parsing (strong competence and rule-to-rule assumption)
- Parsers

# Semantics – interpretation is productive

- We can interpret novel, previously unheard of sentences

Consequences:

- Interpretation is rule based (as opposed to memorized)
- Interpretation proceeds by building bigger blocks out of smaller blocks

What are the smaller blocks? What are the bigger blocks?

→ Constituents

# Understanding productivity

## Principle of compositionality

The meaning of a complex expression is fully determined by its structure (syntax) and the meaning of its constituents (parts)

Stanford Encyclopedia of Philosophy

# Assumptions about parsing

## Strong competence (Bresnan and Kaplan, 1982)

There exists a direct correspondence between the rules of a grammar and the operations performed by the human language processor.

## Rule-to-rule compositionality (Montague, 1973)

Each syntactic rule corresponds to a rule of semantic interpretation.  
( $\Rightarrow$  entities combined by syntactic rules must be semantically interpretable)

# Grammar

I.  $S \rightarrow NP VP$

II.  $NP \rightarrow D N$

III.  $NP \rightarrow NP VP$

the: D

book, opinion: N

IV.  $PP \rightarrow P NP$

V.  $VP \rightarrow V PP$

VI.  $VP \rightarrow V$

fell: V

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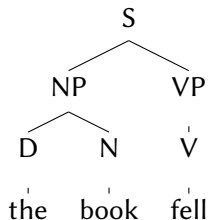
book, opinion: N

IV.  $PP \rightarrow P NP$

V.  $VP \rightarrow V PP$

VI.  $VP \rightarrow V$

fell: V



## Parser: top-down

- I.  $S \rightarrow NP VP$
  - II.  $NP \rightarrow D N$
  - III.  $NP \rightarrow NP VP$
  - IV.  $PP \rightarrow P NP$
  - V.  $VP \rightarrow V PP$
  - VI.  $VP \rightarrow V$
- **expand:** if the stack shows a symbol  $X$  on top, and the grammar contains a rule  $X \rightarrow \alpha$  then replace the stack symbol  $X$  with the sequence of symbols  $\alpha$
  - **scan:** if the stack shows one of the grammar's terminal symbols  $Y$  on top, and  $w$ , the current word being parsed, is of category  $Y$ , then remove  $w$  from the input and  $Y$  from the stack

J. T. Hale, 2014

## ACT-R TD parser; initialize model

```
import pyactr as actr
environment = actr.Environment(focus_position=(320, 180))

actr.chunktype("parsing_goal", "stack_top stack_middle\
stack_bottom parsed_word task")
actr.chunktype("parse_state",
               "mother daughter1 daughter2")
actr.chunktype("word", "form cat")

parser = actr.ACTRModel(environment)
dm = parser.decmem
g = parser.goal
imaginal = parser.set_goal(name="imaginal", delay=0.05)
```



## ACT-R TD parser; add lexical information into decl. memory

```
dm.add(ctr.chunkstring(string="""
    isa      word
    form     evidence
    cat      N
"""))
```

```
g.add(ctr.chunkstring(string="""
    isa      parsing_goal
    task     read_word
    stack_top S
"""))
```

## ACT-R TD parser; add rules

```
parser.productionstring(name="encode word", string=""  
    =g>  
    isa          parsing_goal  
    task         read_word  
    =visual>  
    isa          _visual  
    value        =val  
    ==>  
    =g>  
    isa          parsing_goal  
    task         get_word_cat  
    parsed_word  =val  
    ~visual>  
    """)
```

## ACT-R TD parser; add rules

```
parser.productionstring(name="retrieve category", string=""  
    =g>  
    isa            parsing_goal  
    task          get_word_cat  
    parsed_word    =w  
    ==>  
    +retrieval>  
    isa            word  
    form           =w  
    =g>  
    isa            parsing_goal  
    task          match_category  
    """)
```

## ACT-R TD parser; add rules

```
parser.productionstring(name="match category", string="""
    =g>
    isa            parsing_goal
    task           match_category
    ?retrieval>
    state          free
    buffer         full
    =retrieval>
    isa            word
    cat            =c
    ==>
    =g>
    isa            parsing_goal
    task           parsing
    parsed_word    =c
    """)
```

## ACT-R TD parser; add rules

```
parser.productionstring(name="expand: S ==> NP VP", string=""  
    =g>  
    isa          parsing_goal  
    task         parsing  
    stack_top    S  
    stack_middle =s2  
    ==>  
    =g>  
    isa          parsing_goal  
    stack_top    NP  
    stack_middle VP  
    stack_bottom =s2  
    +imaginal>  
    isa          parse_state  
    mother       S  
    daughter1    NP  
    daughter2    VP  
    """)
```

## ACT-R TD parser; add rules

```
parser.productionstring(name="expand: NP ==> D N", string=""  
    =g>  
    isa          parsing_goal  
    task         parsing  
    stack_top    NP  
    stack_middle =s2  
    ==>  
    =g>  
    isa          parsing_goal  
    stack_top    D  
    stack_middle N  
    stack_bottom =s2  
    +imaginal>  
    isa          parse_state  
    mother       NP  
    daughter1    D  
    daughter2    N  
    """)
```

## ACT-R TD parser; add rules

```
parser.productionstring(name="scan: word", string="""
    =g>
    isa          parsing_goal
    task         parsing
    stack_top     =y
    stack_middle  =x
    stack_bottom  =b
    parsed_word   =y
    ==>
    =g>
    isa          parsing_goal
    task         press_space
    stack_top     =x
    stack_middle  =b
    stack_bottom  None
    parsed_word   None
    """)
```

## ACT-R TD parser; add rules

```
parser.productionstring(name="press spacebar", string="""
    =g>
    isa                parsing_goal
    task                press_space
    stack_top          ~None
    ?manual>
    state              free
    ==>
    =g>
    isa                parsing_goal
    task                read_word
    +manual>
    isa                _manual
    cmd                'press_key'
    key                'space'
    ~imaginal>
    """)
```



## Parser: bottom-up

I.  $S \rightarrow NP VP$

IV.  $PP \rightarrow P NP$

II.  $NP \rightarrow D N$

V.  $VP \rightarrow V PP$

III.  $NP \rightarrow NP VP$

VI.  $VP \rightarrow V$

- **reduce**: if the top of the stack shows a sequence of symbols  $\alpha$ , and there is a grammar rule  $X \rightarrow \alpha$ , then replace  $\alpha$  on the stack with  $X$ .
- **shift**: if the current word of the sentence is  $w$ , push  $w$  on to the top of the stack.

J. T. Hale, 2014

## ACT-R BU parser; initialize model

```
environment = actr.Environment(focus_position=(320, 180))

actr.chunktype("parsing_goal", "stack_1 stack_2 stack_3 sta
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parser = actr.ACTRModel(environment)
dm = parser.decmem
g = parser.goal
imaginal = parser.set_goal(name="imaginal", delay=0.05)
```

## ACT-R BU parser; add rules

```
parser.productionstring(name="shift word and project it", string=""  
    =g>  
    isa          parsing_goal  
    task         retrieving  
    stack_1      =s1  
    stack_2      =s2  
    stack_3      =s3  
    stack_4      =s4  
    stack_5      =s5  
    =retrieval>  
    isa          word  
    cat          =y  
    ==>  
    =g>  
    isa          parsing_goal  
    task         parsing  
    stack_1      =y  
    stack_2      =s1  
    stack_3      =s2  
    stack_4      =s3  
    stack_5      =s4  
    ~retrieval>""")
```

## ACT-R BU parser; add rules

```
parser.productionstring(name="reduce: NP ==> D N", string=""  
    =g>  
    isa          parsing_goal  
    task         parsing  
    stack_1      N  
    stack_2      D  
    stack_3      =s3  
    stack_4      =s4  
    stack_5      =s5  
    ==>  
    =g>  
    isa          parsing_goal  
    stack_1      NP  
    stack_2      =s3  
    stack_3      =s4  
    stack_4      =s5  
    stack_5      None  
    +imaginal>  
    isa          parse_state  
    mother       NP  
    daughter1    D  
    daughter2    N""")
```

## ACT-R BU parser; add rules

```
parser.productionstring(name="press spacebar", string=""  
    =g>  
    isa          parsing_goal  
    task         parsing  
    ?manual>  
    state        free  
    ?imaginal>  
    state        free  
    ==>  
    =g>  
    isa          parsing_goal  
    task         read_word  
    +manual>  
    isa          _manual  
    cmd          'press_key'  
    key          'space'  
    ~imaginal>  
    """, utility=-10)
```

## Parser: left-corner (eager)

- I.  $S \rightarrow NP VP$
  - II.  $NP \rightarrow D N$
  - III.  $NP \rightarrow NP VP$
  - IV.  $PP \rightarrow P NP$
  - V.  $VP \rightarrow V PP$
  - VI.  $VP \rightarrow V$
- **project**: if the top of the stack is a symbol  $Y$ , and there is a grammar rule  $X \rightarrow Y \beta$  whose right-hand side starts with  $Y$ , then replace  $Y$  with new symbols: an expectation for each of the remaining righthand side symbols, and a record that  $X$  has been found
  - **project+complete**: if the top of the stack is  $Y$ , and right below it is an expectation  $[X]$ , then replace both with the remaining expectations  $\beta$
  - **shift**: if the current word of the sentence is  $w$ , push  $w$  on to the top of the stack.

Resnik, 1992

## ACT-R LC parser; add rules

```
parser.productionstring(name="project and complete: NP ==> D N", string
    =g>
    isa                parsing_goal
    stack_1            D
    stack_2            NP
    stack_3            =s3
    stack_4            =s4
    ==>
    =g>
    isa                parsing_goal
    stack_1            N
    stack_2            =s3
    stack_3            =s4
    stack_4            None
    +imaginal>
    isa                parse_state
    mother              NP
    daughter1           D
    daughter2           N
    """)
```

## ACT-R LC parser; add rules

```
parser.productionstring(name="project: NP ==> D N", string=""  
    =g>  
    isa                parsing_goal  
    stack_1            D  
    stack_2            =s2  
    stack_2            ~NP  
    stack_3            =s3  
    stack_4            =s4  
    ==>  
    =g>  
    isa                parsing_goal  
    stack_1            N  
    stack_2            NP  
    stack_3            =s2  
    stack_4            =s3  
    +imaginal>  
    isa                parse_state  
    mother              NP  
    daughter1           D  
    daughter2           N  
    """)
```



### Top-down:

- **expand**: if the stack shows a symbol  $X$  on top, and the grammar contains a rule  $X \rightarrow \alpha$  then replace the stack symbol  $X$  with the sequence of symbols  $\alpha$
- **scan**: if the stack shows one of the grammar's terminal symbols  $Y$  on top, and  $w$ , the current word being parsed, is of category  $Y$ , then remove  $w$  from the input and  $Y$  from the stack

### Bottom-up:

- **reduce**: if the top of the stack shows a sequence of symbols  $\alpha$ , and there is a grammar rule  $X \rightarrow \alpha$ , then replace  $\alpha$  on the stack with  $X$ .
- **shift**: if the current word of the sentence is  $w$ , push  $w$  on to the top of the stack.

### Left-corner (eager):

- **project**: if the top of the stack is a symbol  $Y$ , and there is a grammar rule  $X \rightarrow Y \beta$  whose right-hand side starts with  $Y$ , then replace  $Y$  with new symbols: an expectation for each of the remaining righthand side symbols, and a record that  $X$  has been found
- **project+complete**: if the top of the stack is  $Y$ , and right below it is an expectation  $[X]$ , then replace both with the remaining expectations  $\beta$
- **shift**: if the current word of the sentence is  $w$ , push  $w$  on to the top of the stack.

# Parsers and interpretation

I.  $S \rightarrow NP VP$

IV.  $PP \rightarrow P NP$

II.  $NP \rightarrow D N$

V.  $VP \rightarrow V PP$

III.  $NP \rightarrow NP VP$

VI.  $VP \rightarrow V NP$

(23) The evidence examined by the doctor...

# Summary

- I. Bottom-up parsing coupled with compositionality predicts (the effect of) incremental interpretation too late
- II. Top-down & left-corner parsing (with the standard theory of adjunction) predict that the decision happens before the disambiguating incremental interpretation
- III. For top-down & left-corner parsers: Incremental interpretation has to be able to interpret incomplete constituents

Setting the stage

Theoretical considerations & parsing

Appendix: developments & refinements

## Solution I: Steedman, 2001

- bottom-up parsing using Combinatory Categorical Grammar
- only constituents (well-formed syntactic objects) receive interpretation
- Interpretation becomes incremental due to extra composition rules

## Notation of bottom-up parser

the:D   lawyer:N   examined:VBD   the:D   evidence:N

NP → D N                          NP → D N

-----

NP    VP → VBD NP

-----

S → NP VP

-----

S

# Bottom-up parsing rule

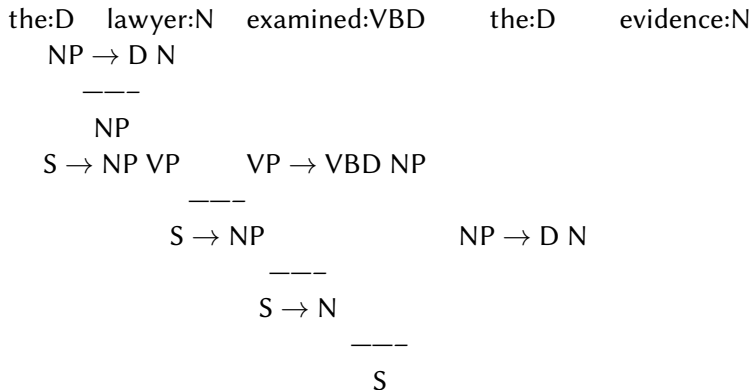
## Current rule

- If you have evidence for A and B and you have a rule  $X \rightarrow A B$ , postulate X

## Extra rule (rule composition)

- Two rules:  $X \rightarrow A B$ ,  $B \rightarrow C Y$
- You have evidence for A and C (being empty counts as evidence)
- Postulate a new *rule*,  $X \rightarrow Y$

## Bottom-up parser with extra rule





## Bottom-up parser with extra rule

The parser can parse incrementally:

(24) The woman that John saw...

The parser *cannot* parse incrementally:

(25) The woman that every man saw...

Demberg, 2012

Coordination as a constituency test:

(26) [ books that every ] and [ journals that no ] accordionist  
liked (?)

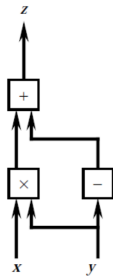
# Solution II: Interpreting non-constituents is valid

Stabler, Shieber and Johnson

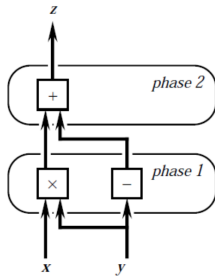
(27) The evidence examined...

- (27) is a non-constituent, but it can be interpreted (why should it not?)
- Dropping the strict mapping between syntax and semantics – enough for top-down and left-corner parser
- On bottom-up parser and adjunction: Shieber and Johnson, 1993

# Asynchronous processing



(a)



(b)

(a) – asynchronous

(b) – synchronous

(b) – in some conditions disadvantaged:

$x = 1$ , or  $y = 0$

Circuit for computing:  $z = xy + (-y)$

# Summary

- top-down parsing, bottom-up parsing, left-corner parsing
- incremental interpretation and the limits with bottom-up parsing
- incremental interpretation and the interpretation of non-constituents

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