## ACS Syntax and Semantics of Natural Language Lecture 4: CCG Applied to Real Text



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Pierre Vinken, 61 years old, will join the board as a non-executive director Nov. 29.

Activation of the CD28 surface receptor provides a major costimulatory signal for T cell activation resulting in enhanced production of interleukin-2 (IL-2) and cell proliferation.

The Trust's symbol, a sprig of oak leaves and acorns, is thought to have been inspired by a carving in the cornice of the Alfriston Clergy House.

 Can we really move from simple "linguistic" examples to sentences like these found in the real world?

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Pierre N/N Vinken N , , 61 N/N years N old (S[adj] NP) NP , , will (S[dcl] NP)/(S[b] NP) join ((S[b] NP)/PP)/NP the NP/N board N as PP/NP a NP/N nonexecutive N/N director N Nov. ((SNP) (SNP))/N 29 N . | .
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- Needs an  $N \to NP$  rule
- $S[adj] \setminus NP$  is for predicative adjectives, e.g. the man is old
- We need a unary type-changing rule:  $S[adj] \setminus NP \rightarrow NP \setminus NP$
- We need special rules in the parser to deal with punctuation
- Only need application in this example (no composition or type-raising)

- S category often has a grammatical feature which indicates the kind of sentence or verb phrase
  - -S[dcl] declarative sentence
  - -S[q] yes/no questions
  - -S[b] bare infinitives
  - -S[to] to infinitives
  - -S[pss] past participles in passive mode
  - -S[pt] past participles in active mode
  - -S[ng] present participles
  - **–** . . .
- See p.59 of Julia's thesis for full list
- S in adverbial modifiers, e.g.  $(S \setminus NP)/(S \setminus NP)$ , effectively has a variable feature:  $(S[X] \setminus NP)/(S[X] \setminus NP)$ , which unifies with the feature on the argument and transfers to the result

Activation N of NPNP)/NP the NP/N CD28 N/N surface N/N receptor N provides (S[dcl]\NP)/NP a NP/N major N/N costimulatory N/N signal N for (NP\NP)/NP T (N/N)/(N/N) cell N/N activation N resulting (S[ng]\NP)/PP in PP/NP enhanced N/N production N of (NP\NP)/NP interleukin-2 N (|( IL-2 N )|) and conj cell N/N proliferation N .|.

- Needs a unary type-changing rule:  $S[ng] \backslash NP \rightarrow (S \backslash NP) \backslash (S \backslash NP)$
- Need special rules to deal with brackets
- Still only needs application

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The NP/N Trust N 's (NP/N) NP symbol N , |, a NP/N sprig N of | (NP\NP) / NP oak | N/N leaves | N and | conj acorns | N , |, is | (S[dcl] \ NP) / (S[pss] \ NP) thought | (S[pss] \ NP) / (S[to] \ NP) to | (S[to] \ NP) / (S[b] \ NP) have | (S[b] \ NP) / (S[pt] \ NP) been | (S[pt] \ NP) / (S[pss] \ NP) inspired | S[pss] \ NP by | ((S\NP)) \ (S\NP)) / NP a | NP/N carving | N in | (NP\NP) / NP the | NP/N cornice | N of | (NP\NP) / NP the | NP/N Alfriston | (N/N) / (N/N) Clergy | N/N House | N . | .
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- Still only need application
- No unary type-changing rules in this example

 Without type-changing rules (notice that the category for used is nonstandard and the category for once changes also):

$$\frac{A \ form \ of \ asbestos}{NP} \quad \frac{once}{(NP \backslash NP)/(NP \backslash NP)} \frac{used}{(NP \backslash NP)/(S[to] \backslash NP)} \frac{to \ make \ Kent \ cigarettes}{S[to] \backslash NP}$$

• With type-changing rules (uses standard categories for *used* and *once*):

A form of asbestos	once	used	to make Kent cigarettes
NP	$\overline{(S\backslash NP)/(S\backslash NP)}$	$\overline{(S[pss]\backslash NP)/(S[to]\backslash NP)}$	$S[to]\NP$
		$S[pss] \backslash NP$	
		$NP \backslash NP$	

Type-changing rules increase the compactness of the lexicon (capturing generalisations) and reduce the number of categories assigned to modifiers such as once

 Object extraction from a relative clause, using type-raising and forward composition:

$$\frac{That}{NP} \frac{finished}{(S[dcl] \backslash NP)/NP} \frac{the\ job}{NP} \frac{that}{(NP \backslash NP)/(S[dcl]/NP)} \frac{Captain\ Chandler}{NP} \frac{had}{(S[dcl] \backslash NP)/(S[pt] \backslash NP)} \frac{begun}{(S[dcl] \backslash NP)/(S[pt] \backslash NP)}$$

Question with an object extraction:

$$\frac{What}{(S[wq]/(S[q]/NP))/N} \xrightarrow{books} \frac{did}{N} \frac{he}{(S[q]/(S[b]\backslash NP))/NP} \xrightarrow{NP} \frac{author}{(S[b]\backslash NP)/NP}$$

• Subject extraction from an embedded clause:

$$\frac{\textit{the revolution}}{\textit{NP}} \quad \frac{\textit{which}}{(\textit{NP} \backslash \textit{NP})/(S[\textit{dcl}] / \textit{NP})} \quad \frac{\textit{he}}{\textit{NP}} \quad \frac{\textit{pretended}}{(S[\textit{dcl}] \backslash \textit{NP})/(S[\textit{dcl}] \backslash \textit{NP})} \quad \frac{\textit{did}}{(S[\textit{dcl}] \backslash \textit{NP})/(S[\textit{b}] \backslash \textit{NP})} \quad \frac{\textit{exist}}{(S[\textit{dcl}] \backslash \textit{NP})} \quad \frac{\textit{exist}}{$$

Real Coordination Example

 $\frac{children}{NP} \frac{were}{(S[dcl] \backslash NP)/(S[adj] \backslash NP)} \frac{more}{(S \backslash NP)/(S \backslash NP)} \frac{apt}{(S[adj] \backslash NP)/(S[to] \backslash NP)} \frac{to}{(S[to] \backslash NP)/(S[b] \backslash NP)} \frac{avoid}{(S[b] \backslash NP)/(NP)}$   $\frac{or}{conj} \frac{be}{(S[b] \backslash NP)/(S[pss] \backslash NP)} \frac{shocked}{S[pss] \backslash NP} \frac{by}{((S \backslash NP) \backslash (S \backslash NP))/NP} \frac{nudity}{NP}$ 

References 10

 CCGbank: A Corpus of CCG Derivations and Dependency Structures Extracted from the Penn Treebank. Julia Hockenamier and Mark Steedman. Computational Linguistics. 2007

 Data and models for statistical parsing with Combinatory Categorial Grammar, Julia Hockenmaier, PhD thesis, Edinburgh, 2003