Projecting Propbank Roles onto the CCGbank

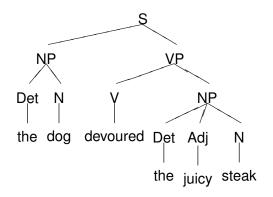
Stephen A. Boxwell and Michael White

The Ohio State University

The Penn Treebank WSJ section

- Tens of thousands of sentences from the Wall Street Journal
- Annotated with Part-of-Speech and syntactic structure
- Widely used for a variety of NLP tasks.

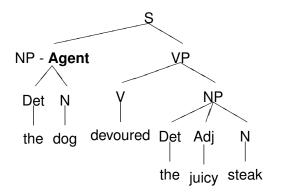
The Penn Treebank WSJ section



The Propbank

- Annotates semantic roles on Penn Treebank trees
- Distinguishes argument roles from modifier roles (manner of action, duration, etc)
- Identifies role-bearing constituents using terminal index and height
- Example: the "Agent" is at terminal index 2, at height 1

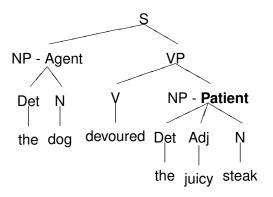
Penn Treebank Tree with Semantic Role annotated



Agent: terminal index 2, height 1



Penn Treebank Tree with Semantic Role annotated



Agent: terminal index 2, height 1 **Patient**: terminal index 6, height 1



The CCGbank

- Combinatory Categorial Grammar is a grammar formalism that treats words as functions and arguments
- A corpus of CCG derivations derived automatically from the Penn Treebank
- CCGbank removes traces and some punctuation
- CCGbank is binary branching, PTB is not.

The CCG formalism

- CCG uses syntactically informative lexical categories
- \bullet Slash direction (/ or \backslash) indicates direction of combinatory potential
 - NP/N = determiner (the, a)
 - PP/NP = preposition (to, with)
 - S\NP = intransitive verb (sleep, die)
 - (S\NP)/NP = transitive verb (devour, love)
 - ((S\NP)/NP)/NP = ditransitive verb (give)
 - ((S\NP)/PP)/NP = ditransitive verb (put)

The dog devoured the juicy steak



$$\frac{\textit{The}}{\mathsf{np/n}} \ \frac{\textit{dog}}{\mathsf{n}} \ \frac{\textit{devoured}}{(\mathsf{s} \backslash \mathsf{np})/\mathsf{np}} \ \frac{\textit{the}}{\mathsf{np/n}} \ \frac{\textit{juicy}}{\mathsf{n/n}} \ \frac{\textit{steak}}{\mathsf{n}}$$

$$\frac{\textit{The}}{\frac{\mathsf{np/n}}{\mathsf{np}}} \stackrel{\textit{dog}}{\stackrel{\mathsf{n}}{\mathsf{opoly}}} \stackrel{\textit{devoured}}{\stackrel{\mathsf{np/n}}{\mathsf{opoly}}} \stackrel{\textit{the}}{\stackrel{\mathsf{np/n}}{\mathsf{opoly}}} \stackrel{\textit{juicy}}{\stackrel{\mathsf{np/n}}{\mathsf{opoly}}} \stackrel{\textit{steak}}{\stackrel{\mathsf{np/n}}{\mathsf{opoly}}} >$$

$$\frac{\frac{The}{np/n}}{\frac{np}{n}} \xrightarrow[s]{devoured} \frac{the}{(s \ np)/np} \xrightarrow[np/n]{the} \frac{juicy}{n/n} \xrightarrow[n/n]{steak} \frac{steak}{n}$$

$$\frac{\frac{np}{np}}{\frac{np}{np}} > \frac{steak}{n}$$

$$\frac{ \frac{The}{np/n} \quad \frac{dog}{n}}{np/n} > \frac{\frac{devoured}{(s \backslash np)/np} \quad \frac{the}{np/n} \quad \frac{juicy}{n/n} \quad \frac{steak}{n}}{np/n} > \\ \frac{\frac{n}{np}}{np} > \\ \frac{\frac$$

The CCGbank and Propbank

- The CCGbank cannot be used directly with the Propbank
- CCGbank terminals ≠ PTB terminals
- Binary branching constraint causes tree height mismatch

Inadvisable Application of Propbank Role to Derivation

$$\frac{ \frac{The}{np/n} \quad \frac{dog}{n} \quad \frac{devoured}{(s \backslash np)/np} \quad \frac{the}{np/n} \quad \frac{juicy}{n/n} \quad \frac{steak}{n} }{np - Agent}$$

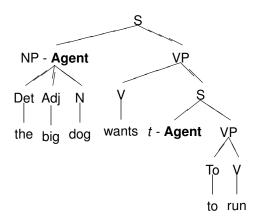
$$\frac{ \frac{np - Agent}{np - Agent}}{\frac{np}{np}}$$

$$\frac{np - Patient}{np}$$

$$\frac{np}{s \backslash np}$$

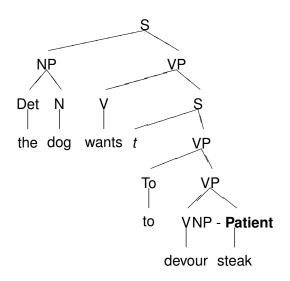
Agent: terminal index 2, height 1 Patient: terminal index 6, height 1

Trace Annotated with Semantic Role



Agent (run): index 3, height 1 AND terminal index 5, height 0

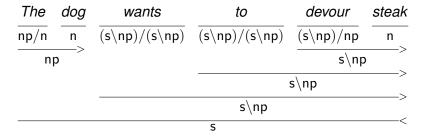




Patient (devour): terminal index 7, height 1

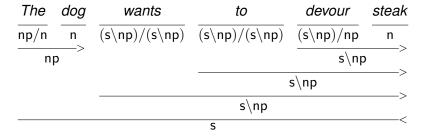
Projecting Propbank Roles onto the CCGbank

Application of Propbank Role to Derivation Impossible



Patient (devour): terminal index 7, height 1

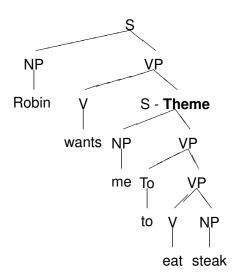
Application of Propbank Role to Derivation Impossible



Patient (devour): terminal index 7, height 1 FAIL

Aligning the CCGbank and Propbank

- Use a minimum edit distance utility to align the terminals of PTB and CCGB
- Create a mapping of PTB terminals to CCGB terminals
- Find a node in the CCG derivation that covers all and only the correct terminals



Theme (want): terminal index 3, height 1



Incorrect Application of Semantic Role to Derivation

Theme (want): terminal index 3, height 1

Incorrect Application of Semantic Role to Derivation

$$\frac{Robin}{\mathsf{np}} \quad \frac{\mathsf{wants}}{\frac{((\mathsf{s} \backslash \mathsf{np})/(\mathsf{s} \backslash \mathsf{np}))/\mathsf{np}}{((\mathsf{s} \backslash \mathsf{np})/(\mathsf{s} \backslash \mathsf{np}))}} \xrightarrow{\mathsf{np}} \quad \frac{\mathsf{to}}{\frac{(\mathsf{s} \backslash \mathsf{np})/(\mathsf{s} \backslash \mathsf{np})}{(\mathsf{s} \backslash \mathsf{np})}} \xrightarrow{\mathsf{s} \backslash \mathsf{np}} \xrightarrow{\mathsf{np}} \xrightarrow{\mathsf{s} \backslash \mathsf{np}} \xrightarrow{\mathsf{np}} \xrightarrow{\mathsf{n$$

Theme (want): terminal index 3, height 1 FAIL

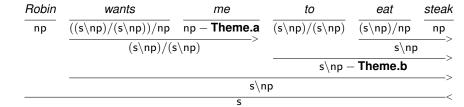
Addressing the Small Clause Mismatch

- Split the role marked on the small clause in two
- Theme → Theme.a, Theme.b
- New notation allows original annotation to be recovered if desired

Incorrect annotation of theme of "wants"

$$\frac{Robin}{np} \quad \frac{wants}{\frac{((s \setminus np)/(s \setminus np))/np}{(s \setminus np)/(s \setminus np)}} \quad \frac{me}{np} \quad \frac{to}{\frac{(s \setminus np)/(s \setminus np)}{\frac{(s \setminus np)/np}}} \quad \frac{steak}{\frac{(s \setminus np)/np}{s \setminus np}} > \\ \frac{s \setminus np}{s \setminus np} > \\ \frac{s \setminus$$

Modified annotation of theme of "wants"



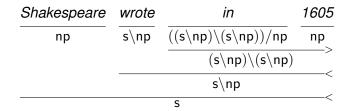
The Argument-Adjunct Distinction

- Penn Treebank does not make a strong distinction between arguments and adjuncts
- Argument adjunct distinction can make a big difference in word-word dependencies, which has implications for generation and semantic role prediction
- CCG theory requires distinction

A Verb Consuming an Argument

$$\frac{Shakespeare}{\mathsf{np}} \quad \frac{\mathit{wrote}}{(\mathsf{s} \backslash \mathsf{np})/\mathsf{np}} \quad \frac{\mathit{Macbeth}}{\mathsf{np}} > \\ \frac{\mathsf{s} \backslash \mathsf{np}}{\mathsf{s}} < \\$$

A Verb Modified by an Adjunct



The Argument-Adjunct Distinction

- Because PTB does not make a good distinction between arguments and adjuncts, CCGbank must make its best guess
- Sometimes CCGbank gets it wrong
- These errors can be identified by discrepencies between Propbank roles and CCGbank categories

An Argument that should be an Adjunct

$$\frac{\frac{join}{((s \backslash np)/pp)/np} \frac{the}{\frac{np/n}{np}} \frac{board}{n} \frac{as}{pp/np} \frac{a}{\frac{np/n}{np}} \frac{director}{n}}{\frac{np}{pp}} > \frac{(s \backslash np)/pp}{s \backslash np} > \frac{s \backslash np}{s}$$

An Adjunct that should be an Argument

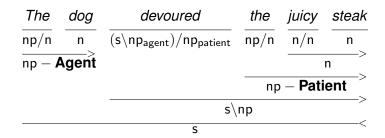
$$\frac{bring}{(s \setminus np)/np} \quad \frac{new}{\frac{n/n}{n}} \quad \frac{attention}{n} \quad \frac{to}{((s \setminus np) \setminus (s \setminus np))/np} \quad \frac{the}{\frac{np/n}{np}} \quad \frac{problem}{n} \\ \frac{n}{np} > \frac{s \setminus np} \quad > \frac{(s \setminus np) \setminus (s \setminus np)}{s \setminus np} > \frac{s \setminus np}{s \setminus np} > \frac{s \setminus np}{s$$

Repairing the CCGbank

- 11569 adjuncts converted to arguments
- 1543 arguments converted to adjuncts
- Modifications reflect the judgement of propbank annotators rather than educated guesses from automatic CCGbank generation algorithm

Why Is This Useful?

- We can use syntactic dependencies to annotate verbal categories with semantic roles
- Creates a mapping from CCG syntactic categories to semantic role frames
- Strong implications for semantic role labeling



How Argument / Adjunct Repair Improves Performance

- 96.85% of syntactic arguments found a numbered role (up from 96.13%)
- 89.24% of semantic roles found a syntactic argument (up from 85.71%)
- differences in improvement reflect the relative number of arguments that are converted to adjuncts, and vice versa.

Current and Future Work

- Current work using the modified CCGbank:
 - Hypertagging generating surface realizations from a logical form (Espinosa, White, and Mehay, ACL 2008)
 - More precise punctuation analysis for CCG realization (White and Rajkumar)

Acknowledgements

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