Proposition Bank II: Delving Deeper

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Abstract

The PropBank project is creating a corpus of text annotated with information about basic semantic propositions. PropBank I (Kingsbury & Palmer, 2002) added a layer of predicateargument information, or semantic roles, to the syntactic structures of the English Penn Treebank. This paper presents an overview of the second phase of PropBank Annotation, PropBank II, which is being applied to English and Chinese, and includes (Neodavidsonian) eventuality variables, nominal references, sense tagging, and connections to the Penn Discourse Treebank (PDTB), a project for annotating discourse connectives and their arguments.

1 Introduction

An important question is the degree to which current statistical NLP systems can be made more domainindependent without prohibitive costs, either in terms of engineering or annotation. The Proposition Bank is designed as a broad-coverage resource to facilitate the development of more general systems. It focuses on the argument structure of verbs, and provides a complete corpus annotated with semantic roles, including participants traditionally viewed as arguments and adjuncts. Correctly identifying the semantic roles of the sentence constituents is a crucial part of interpreting text, and in addition to forming a component of the information extraction problem, can serve as an intermediate step in machine translation or automatic summarization. The Proposition Bank project takes a practical approach to semantic representation, adding a layer of predicateargument information, or semantic roles, to the syntactic structures of the Penn Treebank. The resulting resource can be thought of as shallow, in that it does not represent co-reference, quantification, and many other higher-order phenomena, but also broad, in that it covers every verb in the corpus and allows representative statistics to be calculated. The semantic annotation provided by PropBank is only a first approximation at capturing the full richness of semantic representation. Additional annotation of nominalizations and other noun predicates has already begun at NYU. This paper presents an overview of the second phase of PropBank Annotation, PropBank II, which is being applied to English and Chinese and includes (Neodavidsonian) eventuality variables, nominal references, sense tagging, and discourse connectives.

2 PropBank I

PropBank (Kingsbury & Palmer, 2002) is an annotation of the Wall Street Journal portion of the Penn Treebank II (Marcus, 1994) with `predicate-argument' structures, using sense tags for highly polysemous words and semantic role labels for each argument. An important goal is to provide consistent semantic role labels across different syntactic realizations of the same verb, as in *the window* in [$_{ARG0}$ John] broke [$_{ARG1}$ the window] and [$_{ARG1}$ The window] broke. PropBank can provide frequency counts for (statistical) analysis or generation components in a machine translation system, but provides only a shallow semantic analysis in that the annotation is close to the syntactic structure and each verb is its own predicate.

In PropBank, semantic roles are defined on a verb-byverb basis. An individual verb's semantic arguments are simply numbered, beginning with 0. Polysemous verbs

¹ Associated with Penn Discourse Treebank (PDTB). Other members of the project are Eleni Miltsakaki, Rashmi Prasad, (Univ. of PA) and Bonnie Webber (Univ. of Edinburgh)

have several *Framesets*, corresponding to a relatively coarse notion of word senses, with a separate set of numbered roles, a roleset, defined for each Frameset. For instance, *leave* has both a DEPART Frameset ($[_{ARG0}$ *John] left* [$_{ARG1}$ the room]) and a GIVE Frameset, ($[_{ARG0}$ *I] left* [$_{ARG1}$ my pearls] [$_{ARG2}$ to my daughter-in-law] [$_{ARGM-LOC}$ in my will].) While most Framesets have three or four numbered roles, as many as six can appear, in particular for certain verbs of motion. Verbs can take any of a set of general, adjunct-like arguments (ARGMs), such as LOC (location), TMP (time), DIS (discourse connectives), PRP (purpose) or DIR (direction). Negations (NEG) and modals (MOD) are also marked.

The same annotation philosophy has been extended to the Penn Chinese Proposition Bank (Xue and Palmer, 2003). The Chinese PropBank annotation is performed on a smaller (250k words) and yet growing corpus annotated with syntactic structures (Xue et al 2004). The same syntactic alternations that form the basis for the English PropBank annotation also exist in robust quantities in Chinese, even though it may not be the case that the same exact verbs (meaning verbs that are close translations of one another) have the exact same range of syntactic realization for Chinese and English. For example, in (1), "xin-nian/New Year zhao-daihui/reception" plays the same role in (a) and (b), which is the event or activity held, even though it occurs in different syntactic positions. Assigning the same argument label, Arg1, to both instances, captures this regularity. It is worth noting that the predicate "juxing/hold" does not have passive morphology in (1a), despite of what its English translation suggests. Like the English PropBank, the adjunct-like elements receive more general labels like TMP or LOC, as also illustrated in (1). The tag set for Chinese and English PropBanks are to a large extent similar and more details can be found in (Xue and Palmer, 2003).

(1) a. [ARG1 xin-nian/New Year zhao-daihui/reception] [ARGM-TMP jin-tian/today] [ARGM-LOC zai/at diao-yu-tai/Diaoyutai guo-bin-guan/state guest house ju-xing/hold]

"The New Year reception was held in Diaoyutai State Guest House today."

b. [ARG0 tang-jia-xuan/Tang Jiaxuan] [ARGM-TMP jin-tian/today] [ARGM-LOC zai/at diao-yutai/Diaoyutai guo-bin-guan/state guest house] juxing/hold [arg1 xin-nian/New Year zhao-daihui/reception]

"Tang Jiaxuan was holding the New Year Reception in Diaoyutai State Guest House today."

For polysemous verbs that take different sets of semantic roles, we also distinguish different Framesets. (2) and (3) illustrate the different Framesets of "tongguo/pass", which correspond loosely with major senses of the verb. The Frameset in (2) roughly means "pass by voting" while the Frameset illustrated by (3) means "pass through". The different Framesets are generally reflected in the different alternation patterns, which can serve as a cue for statistical systems performing Frameset disambiguation. (2) is similar to the causative/inchoative alternation (Levin, 1993). In contrast, (3) shows object drop.

(2) a. [ARG0 guo-hui/Congress] zui-jin/recently tongguo/pass le/ASP [ARG1 zhou-ji/interstate yin-hangfa/banking law]

"The U.S. Congress recently passed the inter-state banking law."

b. [ARG1 zhou-ji/interstate yin-hang-fa/banking law] zui-jin/recently tong-guo/pass le/ASP

"The inter-state banking law passed recently."

(3) a. [ARG0 huo-che/train] zheng-zai/now tongguo/pass [ARG1 sui-dao/tunnel]

"The train is passing through the tunne."

b. [ARG0 huo-che/train] zheng-zai/now tong-guo/pass.

"The train is passing."

There are also some notable differences between Chinese PropBank and English PropBank. In general, the verbs in the Chinese PropBank are less polysemous, with the vast majority of the verbs having just one Frameset. On the other hand, the Chinese PropBank has more verbs (including static verbs which are generally translated into adjectives in English) normalized by the corpus size.

3 Adding Event Variables to PropBank

Event variables provide a rich analytical tool for analyzing verb meaning. Positing that there is an event variable allows for a straightforward representation of the logical form of adverbial modifiers, the capturing of pronominal reference to events, and the representation of nouns that refer to events. For example, event variables make it possible to have direct reference to an event with a noun phrase, as in (4a) *destruction*, and to refer back to an event with a pronoun (as illustrated in (4b) *That*):

(4) a. The destruction of Pompeii happened in the 1st century.

b. Brutus stabbed Caesar. That was a pivotal event in history.

PropBank I annotations can be translated straightforwardly into logical representations with event variables, as illustrated in (5), with relations being defined as predicates of events, and Args and ArgMs representing relations between event variables and corresponding phrases.

(5) a. *Mr. Bush met him privately, in the White House, on Thursday.*

b. PropBank annotation Rel: met Arg0: Mr. Bush ArgM-MNR: privately ArgM-LOC: in the White House ArgM-TMP: on Thursday

c. Logical representation with an event variable
∃e meeting(e) & Arg0(e, Mr. Bush) & Arg1(e, he)
& MNR(e, privately) & LOC(e, 'in the White House') & TIME(e, 'on Thursday')

As the representation in (5c) shows, we adopt Neodavidsonian analysis of events, which follows Parsons (1990) in treating arguments on a par with modifiers in the event structure. An alternative analysis is the original Davidsonian analysis of events (Davidson 1967), where the arguments of the verb are analyzed as its logical arguments.

Our choice of a Neodavidsonian representation is motivated by its predictions with respect to obligatoriness of arguments. Under the Davidsonian approach, arguments are logical arguments of the verb and thus must be implied by the meaning of the sentence, either explicitly or implicitly (i.e. existentially quantified). On the other hand, it has been a crucial assumption in PropBank that not all roles must necessarily be present in each sentence. For example, the Frameset for the verb *serve*, shown in (6a) has three roles: Arg0, Arg1, and Arg2. Actual usages of the verb, on the other hand, do not require the presence of all three roles. For example, the sentence in (6b), as its PropBank annotation in (6c) shows, does not include Arg1.

(6) a. serve.01 "act, work": Arg0:worker Arg1:job, project Arg2:employer

> b. Each new trading roadblock is likely to be beaten by institutions seeking better ways *trace* to serve their high-volume clients.

c. Arg0: *trace* -> institutions REL: serve Arg2: their high-volume clients

As the representations in (7) illustrate, only the Neodavidsonian representation gives the correct interpretation of this sentence.

(7) Davidsonian representation:

 $\exists e \exists z \text{ serve}(e, \text{ institutions, } z, \text{ their high-volume clients})$

Neodavidsonian representation: ∃e serve(e)&Arg0(e, institutions)&Arg2(e, their high-volume clients)

Assuming a Neodavidsonian representation, we can analyze all Args and certain types of modifiers as predicates of events. The types of ArgMs that can be analyzed as predicates of event variables are shown below:

- MNR: to manage businesses profitably
- TMP: to run the company for 23 years
- LOC: to use the notes on the test
- DIR: to jump up
- CAU: because of ...
- PRP: in order to ...

Whereas for the most part, translating these adverbials into modifiers of event variables does not require manual annotation, certain constructions need human revision. For example, in the sentence in (8a) the temporal ArgM 'for the past five years' does not modify the event variable e introduced by the verb *manage*, as our automatic translation would predict. The revised analysis of this sentence, given in (8b), follows Krifka 1989, who proposed that negated sentences refer to maximal events – events that have everything that happened during their running time as a part. Annotation of this sentence would thus require us to introduce an additional event variable, the maximal event e', which has a duration 'for the past five years' and has no event of unions managing wage increases as part.

- (8) a. For the past five years, unions have not managed to win wage increases.
 b. ∃e' TMP(e', 'for the past five years') & ∃¬e(e<e' & managing(e) & Arg0(e, unions) &
 - Arg1(e, 'win wage increases'))

Further annotation involves linking empty categories in PropBank to event variables in cases of control, as illustrated in (9), where event variables can be viewed as the appropriate antecedents for PRO, marked as '*' below:

(9) The car collided with a lorry, * killing both drivers.

And, finally, we will consider tagging variables according to the aspectual class of the eventuality they denote, such as states or events. Events, such as *John built a house*, involve some kind of change and usually imply that some condition, which obtains when the event begins, is terminated by the event. States, on the other hand, do not involve any change and hold for varying amounts of time. It does not make sense to ask how long a state took (as opposed to events), and whether the state is culminated or finished.

This distinction between states and events plays an important role for the temporal analysis of discourse, as the following examples (from Kamp and Reyle 1993) illustrate:

(10) a. A man entered the White Hart. Bill served him a beer.

b. I arrived at the Olivers' cottage on Friday night. It was not a propitious beginning to my visit. She was ill and he in a foul mood.

If a non-initial sentence denotes an event, then it is typically understood as following the event described by the preceding sentence. For example, in (10a), the event of Bill serving a beer is understood as taking place after the event of 'a man entering the White Hart' was completed. On the other hand, states are interpreted as temporally overlapping with the time of the preceding sentence, as illustrated in (10b). The sentences *she was ill* and *he was in a foul mood* seem to describe a state of affairs obtaining at the time of the speaker's arrival.

As this example illustrates, there are different types of temporal relations between eventualities (as we will call both events and states) and adverbials that modify them, such as temporal overlap and temporal containment. Furthermore, these relations crucially depend on the aspectual properties of the sentence. Translation of PB annotations to logical representations with eventuality variables and tagging these variables according to their aspectual type would thus make it possible to provide an analysis of temporal relations. This analysis should also be compatible with a higher level of annotation of temporal structure (e.g. Ferro et al, 2001).

4 Annotation of Nominal Coreference

Our approach to coreference annotation is based on the recognition of the different types of relationships that might be called "coreference". The most straightforward case is that of two semantically definite NPs that refer to identical entities, as in (11). Anaphoric relations (very broadly defined) are those in which one NP (or possessive adjective) has no referential value of its own but depends on an antecedent for its interpretation.

In some cases this can be relatively simple, as in (12), in which the pronoun *He* takes *John Smith* as its antecedent. However, in some cases, as in (13), the antecedent may not even be a referring expression, or can, as in (14), refer to an entity that may or may not exist, with the non-existent *a car* being the antecedent of *it*. The anaphor does not have to be an NP, as in (15), in which the possessive *their*, which takes *many companies* as its antecedent, is an adjective.

- (11) John Smith of Company X arrived yesterday. Mr. Smith said that..."
- (12) John Smith of Company X arrived yesterday. He said that..."
- (13) No team spoke about its system.
- (14) I want to buy a car. I need it to go to work.
- (15) Many companies raised their payouts by more than 10%.

Another level of complexity is raised by NPs that are not anaphors, in that they have their own reference (perhaps abstract or nonexistent), but are not in an identity relationship with an antecedent, but rather describe a property of that antecedent. Typical cases of this are predicate nominals, as in (16), or appositives, as in (17), and other cases as in (18).

- (16) Larry is a university lecturer.
- (17) Larry, the chair of his department, became president.
- (18) The stock price fell from \$4.02 to \$3.85

As has been discussed (e.g., van Deemter & Kibble, 2001), such cases have fundamentally different properties than either the identity relationships of (11) or the anaphoric relationships of (12)-(15).

Annotation of nominal co-reference is being done in two passes. The first pass involves annotation of true co-reference between semantically definite NPs[`]. The issue here is to consider what the semantically definite nouns are. Initially, they are defined as proper nouns (named entities), either as NPs (*America*) or prenominal adjectives (*American politicians*).

(19) The last time the S&P 500 yield dropped below 3% was in the summer of 1987... There have been only seven other times when the yield on the S&P 500 dropped....

It is reasonable to expand this to definite descriptions, so that in (19), *the S&P 500 yield* and *the yield on the S&P 500* are marked as coreferring. However, some definite NPs can refer to clauses, not NPs, such as *The pattern* in (20), and we will not do such cases of clausal antecedents on the first pass.

(20) The index fell 40% in 1975 and jumped 80% in 1976. The pattern is an unusual one.

Anaphoric relations are being done on a "need-toannotate" basis. For each anaphoric NP or possessive adjective, the annotator needs to determine its antecedent. As discussed, this is a different type of relation than identity, and this distinction will be noted in the annotation. The issue here is what we consider an anaphoric element to be. We consider all cases of pronouns, possessives, reflexives, and NPs with that/those to be potential cases of anaphors (again, broadly defined). However, as with definite NPs, we only mark those that have an NP antecedent, and not clausal antecedents. For example, in (21), it refers to the current 3.3% reading, and so would be marked as being in an antecedent-anaphor relation. In (22), it refers to having the dividend increases, which is not an NP, and so would not be marked as being in an anaphor relation in the first pass. Similar considerations apply to potential anaphors like those NP, that NP, etc.

- (21) ... the current 3.3% reading isn't as troublesome as it might have been.
- (22) Having the dividend increases is a supportive element in the market outlook, but I don't think it's a main consideration".

Note that placing the burden on the anaphors to determine what gets marked as being in an anaphorantecedent leaves it open as to what the antecedent might be, other than the requirement just mentioned of it being an NP. Not only might it be non-referring NPs as in (13) or (14), it could even be a generic, as in (23), in which *books* is the antecedent for *they*.

(23) I like books. They make me smile.

The second pass will tackle the more difficult issues:

1. Descriptive NPs, as in (16)-(18). While the information provided by these cases would be extremely valuable for information extraction and other systems, there are some uncertain issues here, mostly focusing on how such descriptors describe the antecedent at different moments in time and/or space. The crucial question is therefore what to take the descriptor to be.

(24) Henry Higgins might become the president of Dreamy Detergents.

For example, in (18), it can't be just \$4.02 and \$3.85, since this does not include information about *when* the stock price had such values. The same issue arises for (17). As van Deemter & Kibble point out, such

cases can interact with issues of modality in uncertain ways, as illustrated in (24). Just saying that in (24) *the president of Dreamy Detergents* is in the same type of relationship with *Henry Higgins* as *a university lecturer* is with *Larry* in (16) would be very misleading.

2. Clausal antecedents - Here we will handle cases of *it* and other anaphor elements and definite NPs referring to non-NPs as antecedents, as in (21). This will most likely be done by referring to the eventuality variable associated with the antecedent.

5 Linking to the Penn Discourse Treebank (PDTB)

The Penn Discourse Treebank (PDTB) is currently being built by the PDTB team at the University of Pennsylvania, providing the next appropriate level of annotation: the annotation of the predicate argument structure of connectives (Miltsakaki et al 2004a/b). The PDTB project is based on the idea that discourse connectives can be thought of as predicates with their associated argument structure. This perspective of discourse is based on a series of papers extending lexicalized treeadjoining grammar (LTAG) to discourse (DLTAG), beginning with Webber and Joshi (1998).² This level of annotation is quite complex for a variety of reasons, such as the lack of available literature describing discourse connectives and frequent occurrences of *empty* (lexically null) connectives between two sentences that cannot be ignored. Also, unlike the predicates at the sentence level, some of the discourse connectives, especially discourse adverbials, take their arguments anaphorically and not structurally, requiring an intimate association with event variable representation.

The long-range goal of the PDTB project is to develop a large scale and reliably annotated corpus that will encode coherence relations associated with discourse connectives, including their argument structure and anaphoric links, thus exposing a clearly defined level of discourse structure and supporting the extraction of a range of inferences associated with discourse connectives. This annotation will reference the Penn Treebank (PTB) annotations as well as PropBank.

In PDTB, a variety of connectives are considered, such as subordinate and coordinate conjunctions, adverbial connectives and implicit connectives amounting to a total of approximately 20,000 annotations; 10,000 im-

² The PDTB annotations are deliberately kept independent of DLTAG framework for two reasons: (1) to make the annotated corpus widely useful to researchers working in different frameworks and (2) to make the annotation task easier, thereby increasing interannotator reliability.

plicit connectives and 10,000 annotations of the 250 explicit connectives identified in the corpus (for details see (Miltsakaki et al 2004a and Miltsakaki et al 2004b). Current annotations in PDTB are performed by four annotators. Individual annotation proceeds one connective at a time. This way, the annotators quickly gain experience with that connective and develop a better understanding of its predicate-argument characteristics. For the annotation of implicit connectives, the annotators are required to provide an explicit connective that best expressed the inferred relation.

The PDTB is expected to be released by November 2005. The final version of the corpus will also contain characterizations of the semantic roles associated with the arguments of each type of connective as well as links to PropBank.

6. Annotation of Word Senses

The critical question with respect to sense tagging involves the choice of senses. In other words, which sense inventory, and which level of granularity with respect to that sense inventory? The PropBank Frames Files for the verbs include coarse-grained sense distinctions based primarily on usages of a verb that have different numbers of predicate-arguments. These are termed Framesets - referring to the set of roles for each one and the corresponding set of syntactic frames. We are currently sense-tagging the annotated predicates for lemmas with multiple Framesets, which can be done quickly and accurately with an inter-annotator agreement of over 90%. The distinctions made by the Framesets are very coarse, and each one would map to several standard dictionary entries for the lemma in question. More fine-grained sense distinctions could be useful for Automatic Content Extraction, yet it remains to be determined exactly which distinctions are necessary and what methodology should be followed to provide additional word sense annotation.

Palmer et al (2004b) present an hierarchical approach to verb senses, where different levels of sense distinctions, from PropBank Framesets to WordNet senses, form a continuum of granularity. At the intermediate level of sense hierarchy we are considering manual *groupings* of the SENSEVAL-2 verb senses (Palmer, et.al., 2004a), developed in a separate project. Given a large disagreement rate between annotators (average inter-annotator agreement rate for Senseval-2 verbs was only 71%), verbs were grouped by two or more people into sets of closely related senses, with grouping differences being reconciled, and the sense groups were used for coarsegrained scoring of the systems. These groupings of WordNet senses were shown to reconcile a substantial portion of the manual and automatic tagging disagreements, showing that many of these disagreements are fairly subtle. Using the *groups* as a more coarse-grained set of sense distinctions improved ITA and system scores by almost 10%, to 82% and 69%, respectively (Palmer, et. al. 2004a).

We have been investigating whether or not the groups can provide an intermediate level of hierarchy in between the PropBank Framesets and the WN 1.7 senses. Based on our existing WN 1.7 tags and Frameset tags of the Senseval2 verbs in the Penn Treebank, 95% of the verb instances map directly from sense groups to Framesets, with each Frameset typically corresponding to two or more sense groups. Using the PropBank coarse-grained senses as a starting place, and WordNet sense tagging for over 1000 verbs produced automatically through mapping VerbNet to PropBank (Kipper, et. al., 2004), we have the makings of a large scale tagging experiment on the Penn Treebank. This will enable investigations into the applicability of clearly defined criteria for sense distinctions at varying levels of granularity, and produce a large, 1M word corpus of sense-tagged text for training WSD systems

The hierarchical approach to verb senses, as utilized by most standard dictionaries as well as Hector (Atkins, '93), and as applied to SENSEVAL-2, presents obvious advantages for the problem of Word Sense Disambiguation. The human annotation task is simplified, since there are fewer choices at each level and clearer distinctions between them. The automated systems can combine training data from closely related senses to overcome the sparse data problem, and both humans and systems can back off to a more coarse-grained choice when fine-grained choices prove too difficult.

Conclusion

This paper has presented an overview of the second phase of PropBank Annotation, PropBank II, which is being applied to English and Chinese. It includes (Neodavidsonian) eventuality variables, nominal references, an hierarchical approach to sense tagging, and connections to the Penn Discourse Treebank (PDTB), a project for annotating discourse connectives and their arguments.

References

Atkins, S. (1993) Tools for computer-aided corpus lexicography: The Hector Project. *Actu Linguistica Hunguricu*, 41:5-72.

Carlson, L., Marcu, D. and Okurowski, M. E. (2002). Building a Discourse-Tagged Corpus in the Framework of Rhetorical Structure Theory. In Current Directions in Discourse and Dialogue, Jan van Kuppevelt and Ronnie Smith eds., Kluwer Academic Publishers. To appear.

Davidson, D. 1967. The Logical Form of Action Sentences. In *The Logic of Decision and Action*, ed. Nicholas Rescher. 81--95. Pittsburgh: University of Pittsburgh Press. Republished in Donald Davidson, *Essays on Actions and Events*, Oxford University Press, Oxford, 1980.

Edmonds, P. and Cotton, S. 2001. SENSEVAL-2: Overview. In *Proceedings of SENSEVAL-2: Second International Workshop on Evaluating Word Sense Disambiguation Systems*, ACL-SIGLEX, Toulouse, France.

Ferro L, I. Mani, B. Sundheim and G.Wilson 2001 TIDES Temporal Annotation Guidelines, MITRE Technical Report, MTR 01W0000041.

Kamp, H. and U.Reyle. 1993. From Discourse to Logic, Kluwer, Dordrecht.

Kingsbury, P. and Palmer, M, (2002), From TreeBank to PropBank, *Third International Conference on Language Resources and Evaluation, LREC-02*, Las Palmas, Canary Islands, Spain, May 28- June 3.

Kilgarriff, A. and Palmer, M. 2000. Introduction to the special issue on Senseval, *Computers and the Humanities*, 34(1-2):1-13.

Kipper K., B. Snyder, and M. Palmer. (to appear, 2004) "Extending a verb-lexicon using a semantically annotated corpus". *Proceedings of the 4th International Conference on Language Resources and Evaluation* (LREC-04). Lisbon, Portugal, 2004.

Krifka, M. 1989. Nominalreferenz und Zeitkonstitution. München, Wilhelm Fink Verlag

Levin, B. 1993. English Verb Classes and Alternations: a Preliminary Investigation. Chicago: The University of Chicago Press.

Mann, W. and S. Thompson. 1986. "Relational Propositions in Discourse", *Discourse Processes* 9, 57-90.

Marcu, D. 2000. The Theory and Practice of Discourse Parsing and Summarization. The MIT Press.

Miltsakaki, E., R. Prasad, A. Joshi and B. Webber. 2004a. The Penn Discourse Treebank. In Proceedings of the 4th International Conference on Language Resources and Evaluation (LREC 2004), Lisbon.

Miltsakaki, E., R. Prasad, A. Joshi and B. Webber. 2004b. Annotation of Discourse Connectives and Their Arguments, in *Proceedings of the HLT-EACL Workshop on Frontiers in Corpus Annotation*, Boston, Massachussetts.

Palmer, M., Dang, H. T, and Fellbaum, C., 2004a. Making fine-grained and coarse-grained sense distinctions, both manu-

ally and automatically, under revision for *Natural Language Engineering*.

Palmer, M., Babko-Malaya, O., Dang, H. T., 2004b. Different Sense Granularities for Different Applications, to appear in *the Scalable Natural Language Understanding Workshop, held in conjunction with HLT/NAACL-04*, May, 2004.

Parsons, T. 1990. Events in the Semantics of English. Cambridge, MA: MIT Press.

van Deemter, K. and R. Kibble. 2000. "On Coreferring: Coreference in MUC and Related Annotation Schemes", Computational Linguistics 26:629-637.

Webber B. and A. Joshi. 1998. Anchoring a lexicalized tree-adjoining grammar for discourse. In ACL/COLING Workshop on Discourse Relations and Discourse Markers, Montreal, Canada, pp. 41-48.

Xue, N. and Palmer, M. 2003. Annotating the Propositions in the Penn Chinese Treebank. In the *Proceedings of the Second SIGHAN Workshop on Chinese Language Processing*. Sapporo, Japan.

Xue, Nianwen, Xia, Fei, Chiou, Fu-dong and Palmer, Martha. 2004. The Penn Chinese Treebank: phrase structure annotation of a large corpus. *Natural Language Engineering*, 10(4):1-30, June 2004.