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# The NXT-format Switchboard Corpus: A Rich Resource for Investigating the Syntax, Semantics, Pragmatics and Prosody of Dialogue

Sasha Calhoun · Jean Carletta · Jason Brenier · Neil Mayo · Dan Jurafsky · Mark Steedman · David Beaver

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**Abstract** This paper describes a recently completed common resource for the study of spoken discourse, the NXT-format Switchboard Corpus. Switchboard is a long-standing corpus of telephone conversations (Godfrey et al., 1992). We have brought together transcriptions with existing annotations for syntax, disfluency, speech acts, animacy, information status, coreference, and prosody; along with substantial new annotations of focus/contrast, more prosody, syllables and phones. The combined corpus uses the format of the NITE XML Toolkit, which allows these annotations to be browsed and searched as a coherent set (Carletta et al., 2005). The resulting corpus is a rich resource for the investigation of the linguistic features of dialogue and how they interact. As well as describing the corpus itself, we discuss our approach to overcoming issues involved in such a data integration project, relevant to both users of the corpus and others in the language resource community undertaking similar projects.

**Keywords** linguistic annotation  $\cdot$  language resources  $\cdot$  discourse  $\cdot$  prosody  $\cdot$  semantics  $\cdot$  spoken dialogue

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#### **1** Introduction

Corpora that have been augmented with rich linguistic annotation are becoming ever more important for developing and testing theories of language. These range from detailed phonetics, such as the use of phonetic annotations to study lenition and other properties of speech production (Bell et al., 2003; Johnson, 2004; Aylett and Turk, 2004), to the most abstract syntax, such as the use of syntactic treebanks to study facts about information structure (Michaelis and Francis, 2004) or syntactic variation (Bresnan et al., 2007). Because recording and transcribing language is expensive, corpora that are made available with transcription often attract further kinds of annotation. For instance, the Switchboard Corpus of telephone conversations (Godfrey et al., 1992), has been transcribed at the word level and annotated with parts-of-speech and syntactic structure (Marcus et al., 1993), turn and utterance boundaries and disfluency labels (Taylor et al., 2003), dialog acts (Jurafsky et al., 1997; Shriberg et al., 1998), animacy of NPs (Zaenen et al., 2004), information status (Nissim et al., 2004), and prosodic information about prominence and boundaries (Ostendorf et al., 2001).

With such a diverse range of annotations, the Switchboard Corpus had the potential to be a very valuable resource for studying relationships and interfaces between the syntactic, semantic, pragmatic, and prosodic features of spontaneous speech. For example, many experiments have suggested that the relationships between information structure and prosodic prominence (such as whether discourse-new NPs are more likely to bear pitch accent than discourse-old NPs) are complex (e.g. Terken and Hirschberg, 1994; Bard et al., 2000). A corpus that marks both information structure and prosodic prominence (as well as codes for important controls like syntactic structure and disfluency) could significantly advance our understanding of this complex relation. We could ask a wide variety of other kinds of interface questions that are important in linguistics or psycholinguistics (about, for example, the relation between speech acts and syntactic structure, the link between phonetic reduction and information status, or the relationship of disfluency and information status).

Unfortunately, the existing state of the Switchboard Corpus did not allow any of these questions to be asked. This is because these annotations were all produced in different formats by different research groups; worse, they were attached to two different underlying word transcripts of the conversations. Some of the annotations were made on the original transcript or the slightly modified Treebank3 transcript (Marcus et al., 1993; Taylor et al., 2003), while others were made on the later, corrected MS-State transcript (Deshmukh et al., 1998; Harkins, 2003). Moreover, they are not all available from one source. This made it very difficult to use any pair of them in combination, much less the entire set, both in terms of the time needed to do the work and the level of technical skill required. We have overcome this difficulty by integrating all the existing Switchboard annotations into one coherent data set in the format of the NITE XML Toolkit (NXT, Carletta et al., 2005). Integrating these annotations was complicated because it required us to resolve multiple transcripts and unify different segmentations, but the resulting data has much more value than the set of separate component parts. In addition, we have added annotations for two key linguistic features of dialogue, focus/contrast and prosody; as well as syllable and phone information. These new variables, along with the wide variety of annotations already combined into the corpus, make the NXT-format Switchboard Corpus a rich resource for linguistic, psycholinguistic and computational linguistic research.

More documentation about the NXT-format Switchboard Corpus is on the corpus website (http://groups.inf.ed.ac.uk/switchboard/). The corpus has been released by the Linguistic Data Consortium (catalog number LDC2009T26, http://www.ldc.upenn. edu/) under a Creative Commons NonCommercial Share Alike license (http://creativecommons. org/). The Creative Commons licensing, which is similar to that for open source software, is intended to encourage users not only to use the corpus, but to offer any further annotations they make for community use. LDC is developing a separate license offering commercial terms.

We first briefly explain why the NITE XML Toolkit is the best choice for representing this data all together, and then describe each of the annotation layers and how they are represented in the NXT framework. We then show one example of a research question that can easily be investigated using the NXT-format Switchboard Corpus that would be difficult using the annotations separately. We discuss some of the more complex issues which arose in the conversion of legacy resources, particularly those issues that will be relevant for users of the final corpus who are familiar with the original format of one or more annotation. Finally, we discuss the lessons learnt about building this kind of resource generally.

#### 2 Why the NITE XML Toolkit?

In a corpus with as many annotations as Switchboard, it is important for all of them to be in one coherent format, preferably within a framework that can be used to validate the data, read and search it, and browse it in end user tools. There are several such frameworks available, such as TIGER (Brants et al., 2002), annotation graphs (Bird and Liberman, 2001), ATLAS (Laprun et al., 2002), and MMAX2 (Müller and Strube, 2006). For this corpus, we chose the NITE XML Toolkit (NXT, Carletta et al., 2005).

We chose NXT for several reasons. First and foremost, of the frameworks available, only MMAX2, ATLAS, and NXT represent both temporal and explicit structural relationships among annotations. Although annotation graphs, for instance, do represent annotations as a graph structure, the semantics of edges does not cover properties like dominance (i.e. parent/child relationships). This means that such properties must be encoded within the edge labels, with no support given in software for their interpretation. NXT is more flexible in the structural relationships that it can represent than MMAX2, which uses independent standoff layers that point to the same base layer but cannot refer to each other. NXT allows not just more complex relationships, but also independent non-congruent structural annotations, i.e. crossing brackets. The Switchboard Corpus did not need these for the current syntactic annotation because it was originally in Penn Treebank format (Taylor et al., 2003), which does not allow for them, but they are useful for other annotations, as well as for future development. NXT also allows type-checking for long-distance dependencies, which makes checking for consistency much easier than in the original Treebank format (see section 5.2). Further, NXT has more complete handling of signals, including a data handling API that makes it easier to write programs that process the data, and has the advantage of being open source. ATLAS is even more flexible in its data representation than NXT, especially with regard to pointing into signals, but its implementation is unfortunately incomplete.

In addition to its treatment of linguistic structure, NXT also has several other desirable properties. Because it separates annotations into multiple files, different people can create unrelated annotations at the same time without any additional work to merge their output afterward. Structural dominance (i.e. a parent-child relationship) is represented using XML dominance within a single file and using a particular kind of stand-off link for dominance that crosses file boundaries, making it easier to apply conventional XML processing techniques to the data. NXT also comes with a range of end user graphical interfaces for common tasks as well as libraries that can be used to write new ones efficiently. For example, there is a utility which allows users to display conversations one at a time to test queries (see section 4): portions of the text returned by each query are highlighted, so that users do not have to work directly with the XML (e.g. see http://groups.inf.ed.ac.uk/switchboard/start.html). NXT also provides methods for validating that data conforms to the defined storage format. This is an important functionality that is often overlooked. Finally, NXT has an active and growing user community that has already exercised its full range of capabilities, particularly since its adoption for the popular AMI Meeting Corpus (Carletta et al., 2006).

#### 3 The NXT-format Switchboard Corpus: Annotations

The Switchboard Corpus (Godfrey et al., 1992) was collected at Texas Instruments in 1990-1991 and was released by the Linguistic Data Consortium in 1992-3 and then again, with some errors fixed, in 1997. This 1997 "Switchboard 1 Release 2" Corpus contains recordings of about 2400 conversations between 543 speakers of American English. Speakers chose topics of interest (e.g., cars, recycling) from a predetermined list, and were connected to each other automatically by a robotic switchboard operator. Conversations were thus between strangers. Conversations ranged in length from one and a half to ten minutes, averaging six and a half minutes. The corpus totaled roughly three million words. This original release was also transcribed, broken into turns, and diarized (labeling speakers as A and B). The corpus was then slightly improved and released as part of the Penn Treebank 3 Switchboard Corpus (see details in section 3.3). The NXT-format Switchboard Corpus includes 642 of the 650 conversations from the Penn Treebank 3 syntactic release. NXT Switchboard therefore includes just over 830,000 words.

Below, we begin by describing data representation within the NXT framework. We then briefly describe each layer of annotation in the NXT Switchboard, including the original annotation and how it is represented in NXT. We give more details on the *kontrast* (focus/contrast) and prosody annotations, as these have not been published elsewhere.

### 3.1 NXT Framework

NXT models corpus data as a set of 'observations', in this case the Switchboard conversations, which are associated with one or more 'signals', here the stereo audio files. NXT allows the corpus designer to specify a 'metadata' file that describes the intended structure of a corpus; the metadata effectively combines definitions equivalent to a set of schemas for the data files with catalogue information explaining where the files can be found. The metadata file organizes annotations into multiple 'layers' that form descriptions of the corpus. For instance, typically, a transcription layer will contain tags for words, non-word vocalizations, and maybe pauses and punctuation. The designer can specify that a layer should be stored in its own file, or build up 'codings' that contain several layers, each of which hierarchically decomposes the one above it. Structural dominance is represented straightforwardly as either XML dominance, if the parent and child are in the same file, or using a 'stand-off' link notated at the parent node that indicates where to find each out-of-file child. In the data model, all children for a given node must be drawn from the same layer, and any path drawn by following only child links must not contain a cycle. This structure covers most requirements and represents a reasonable trade-off between flexibility and processing efficiency. For where it is insufficient, there is another type of stand-off link, the 'pointer', which is more flexible but incurs higher processing costs.

#### 3.2 Transcriptions: Terminals and Phonwords

Underlying all the annotations we will describe are the string of words that constitute the orthographic transcript for each conversation. Unfortunately, it turns out that there were two distinct orthographic transcripts for the existing corpus, both of which had been substantially annotated. The first is the 1997 re-release of the orthographic transcript of Switchboard, the *Switchboard-1 Release 2* transcript, (Godfrey and Holliman, 1997), cleaned up from the original 1993 Switchboard release. This Switchboard-1 Release 2 transcript was then used as the base for the slightly improved transcript that was included (with other annotations to be described below) in the LDC's *Treebank3* release Marcus et al. (1999). It is this version which we have used in our corpus. To avoid ambiguity, in the rest of this paper we will refer to it as the *Treebank3* transcript.

Because the Treebank3 transcript contained errors and was not time-aligned with the speech signals (Graff and Bird, 2000), the Institute for Signal and Information Processing at Mississippi State University ran a clean-up project which hand-checked and corrected the transcript of the 1126 Treebank conversations. They also produced word alignments, showing, for each transcript word, its start and end times in the audio file; word times were determined automatically, with partial manual corrections (see Deshmukh et al., 1998; Harkins, 2003). We refer to the resulting time-aligned transcript as the *MS-State* transcript.

Since both the Treebank3 and MS-State transcripts had been enriched with distinct annotations, we included both transcripts separately in our corpus, using an NXT pointer to link equivalent words in the two versions. Section 5.1 describes the method used to create the alignment between the two transcriptions. We refer to the words from the Treebank3 transcript as words and the words from the MS-State transcript as phonwords, since the MS-State transcript words have start and end times in the audio file and hence are slightly more phonetically grounded. The double inclusion does result in redundancy, but has the advantage of retaining the internal consistency of prior annotations. For the most part, the MS-State transcription is more accurate than the Treebank3, so the other option would have been to attach all of the annotations that were derived from the Treebank transcription to the MS-State transcription and discard the original Treebank transcription. However, attaching the Treebank annotations exactly as they are would have made the resource difficult for the end-user to interpret. For instance, where the MS-State transcription adds words to the original, the syntactic annotation would appear inconsistent. On the other hand, creating new annotations to cover the changed portions of the transcription would have been timeconsuming for little gain and would have greatly complicated the relationship between the NXT-format data and the original.

Figure 1 shows our solution diagrammatically. As can be seen, where there are differences in the representation of a word in the two transcripts (e.g. in the treatment of contractions like *doesn't*), one Treebank3 'word' may link to more than one MS-State 'phonword', or vice versa.

An extract of the XML representation of 'words' and 'phonwords' is given below (*doesn't* from Figure 1). (Note that NXT has a number of graphical interfaces so that users do not have to work directly with the XML, see section 4). Each word is an XML element with a unique 'nite:id', and a number of attributes, including in this case the start and end times ('nite:start' and 'nite:end'), orthography ('orth'), and part-of-speech type ('pos') for

Fig. 1 Representation of the MS-State and Treebank3 Switchboard transcripts in NXT. Words in the Treebank3 transcript are represented by 'word' elements in one NXT layer, while those in the MS-State transcript are represented by 'phonword' elements in an independent layer. Representations of the same word in the two transcripts are linked by an NXT pointer labeled 'phon'. In some cases, such as contractions, words are tokenized differently in the two transcripts, so there may be multiple 'words' pointing at a 'phonword' or vice versa. Note that the star (\*) shows that this structure is the expansion of the abbreviated word/phonword structure shown in Figure 4.

'words'. The relationship between the elements is shown by a 'nite:pointer' on the 'word', the 'href' attribute of this pointer shows the file and 'nite:id' of the corresponding 'phonword'. All XML examples are taken from the utterance used in Figure 4 (see section 4). The file names are given bottom right, pointer relationships are demonstrated by the dashed lines, ellipses mark omitted parts of the files, and some attributes are not shown.

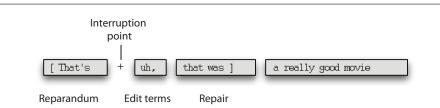


Fig. 2 The reparandum begins with a left square bracket '[' and ends with a '+'. The repair follows the (optional) edit phase after the '+' and ends with a right square bracket ']'.



With this approach, it is possible to use the two transcriptions independently or to traverse between them. For convenience, even though only the MS-State transcription contained timings in the original, we have copied timings over to the corresponding words from the Treebank3 transcription. NXT then automatically percolates these timings up through the discourse annotations based on the Treebank3 transcription.

#### 3.3 Treebank: Utterance Boundaries, Syntax, and Disfluencies

We drew syntactic and disfluency annotations from the Penn Treebank Project (Marcus et al., 1993). The Penn Treebank 3 release of Switchboard included annotations on 1126 of the Switchboard conversations. As we mentioned earlier, the Switchboard Release 2 transcripts had been diarized (divided into turns, each one labeled with A and B speakers). The Treebank3 release in addition segmented each turn into utterances, added part-of-speech tags on each word, and annotated each utterance for disfluencies (Meteer and Taylor, 1995; Taylor et al., 2003).

The 'utterance' unit in the Treebank3 Switchboard release is a sentence-like chunk that was called a 'slash unit' in the original labeling manual (Meteer and Taylor, 1995), and will be parsed as an S in the parse trees described below. The following example shows three utterances, distinguished by slashes. Notice that certain discourse markers or continuers (like *right*, and *yeah*) are segmented as utterances, and that full sentential clauses with conjunctions like *and* are often segmented off as well:

Right, / well, when my kids were little we did have a set / and I did watch a lot of Sesame Street and a lot of Electric Company.

Each word in each utterance is part-of-speech tagged with a tag from the Penn Treebank tagset defined in Table 1.

Disfluencies (also called 'repairs') were annotated following Shriberg (1994). Figure 2 shows the structure of a repair, consisting of a *reparandum* (the 'replaced' words), followed by an optional edit term like *uh* or *you know*, followed by the repair; see Meteer and Taylor (1995); Taylor et al. (2003).

| BES  | 's as form of BE                | PRP\$ | Possessive pronoun               |
|------|---------------------------------|-------|----------------------------------|
| CC   | Coordinating conjunction        | RB    | Adverb                           |
| CD   | Cardinal number                 | RBR   | Adverb, comparative              |
| DT   | Determiner                      | RP    | Particle                         |
| EX   | Existential there               | TO    | Infinitival to                   |
| IN   | Preposition/ subordinating con- | UH    | Interjection, filler, discourse  |
|      | junction                        |       | marker                           |
| JJ   | Adjective                       | VB    | Verb, base form                  |
| JJR  | Adjective, comparative          | VBD   | Verb, past tense                 |
| JJS  | Adjective, superlative          | VBG   | Verb, gerund/ present participle |
| MD   | Modal                           | VBN   | Verb, past participle            |
| NN   | Noun, singular or mass          | VBP   | Verb, non-3rd ps. sing. present  |
| NNP  | Proper noun, singular           | VBZ   | Verb, 3rd ps. sing. present      |
| NNPS | Proper noun, plural             | WDT   | Wh-determiner                    |
| NNS  | Noun, plural                    | WP    | Wh-pronoun                       |
| PDT  | Predeterminer                   | WRB   | Wh-adverb                        |
| POS  | Possessive ending               | XX    | Partial word, POS unclear        |
| PRP  | Personal pronoun                |       |                                  |
|      |                                 |       |                                  |

Table 1 NXT Word Part-of-Speech (pos) Values (from Treebank)

Finally, the Treebank3 release of Switchboard also included 650 of the conversations (a subset of the 1126) with full syntactic parse trees. 642 of these are included in the NXT-format Switchboard Corpus release; the remaining 8 were excluded because of difficulties in processing them. The phrase level categories used in the Treebank syntactic parse trees for Switchboard are shown in Table 2. Note that the set of phrase level categories in Table 2 includes tags for the interruption point (IP), reparandum (RM), and restart/repair (RS) components of disfluencies. Long distance dependencies marked in the Treebank are represented by 'movement' elements in NXT, which show links between traces and antecedents. Syntactic phrases are also optionally marked with grammatical function tags (surface subject, logical subject) as well as semantic role tags like direction, location, manner, purpose, and time; these function tags are shown in Table 3.

In summary, the following syntactic and disfluency features are included in the NXTformat Switchboard Corpus based on the Treebank3 transcript:

Part of speech: Penn Treebank part-of-speech (as an attribute on the terminals).

**Turns:** Syntactic sentences grouped by conversation turns and diarized (speaker A or B). **Utterances:** Utterance boundaries (as the units on which *dialog acts* are marked).

Syntax: Penn Treebank syntactic categories (Marcus et al., 1993; Taylor et al., 2003).

- **Movement (Long distance dependencies):** Links between *traces* and *antecedents* as coindexed in the Treebank. For example, in "What book<sub>i</sub> did you buy  $t_i$ ?", *what book* is the antecedent of the trace, *t*.
- **Disfluency:** Treebank disfluency coding, including *reparanda* (hesitations or false starts), *interruption points*, and *repairs*, e.g. "[the-]<sub>*reparandum*</sub> [the government]<sub>*repair*</sub>".

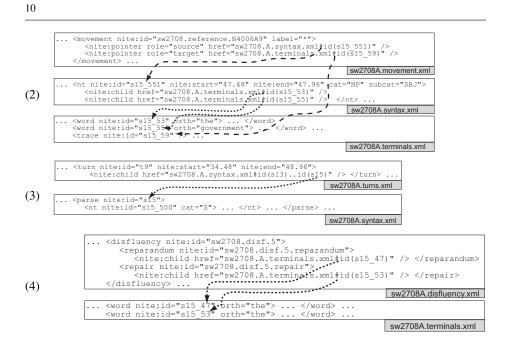
An extract of the XML representation of 'syntax' and 'movement' is given in (2), 'turns' in (3) and 'disfluency' in (4), using the same format as (1) above (note that pointer relationships are shown by dashed lines, and child relationships by dotted lines). The antecedent in each 'movement' element is identified by a 'source' pointer, and the trace by a 'target' 
 Table 2
 NXT Non-Terminal (nt) Category (cat) Values (from Treebank)

| ADVP<br>CONJP<br>EDITED<br>FRAG | Adverb Phrase<br>Conjunction Phrase<br>Reparandum in disfluency<br>Fragment | RM<br>RS<br>S<br>SBAR | Reparandum in disfluency<br>Restart after disfluency<br>Simple declarative clause<br>Clause introduced by a (possi-<br>bly empty) subordinating con-<br>junction |
|---------------------------------|---|-----------------------|--|
| INTJ                            | Interjection, for words tagged UH   | SBARQ                 | Direct question introduced by a <i>wh</i> -word or <i>wh</i> -phrase   |
| IP                              | Interruption point in disflu-<br>ency                                       | SQ                    | Inverted <i>yes/no</i> question, or main clause of a <i>wh</i> -question   |
| NAC                             | Not a constituent   | TYPO                  | Speech Error   |
| NP                              | Noun Phrase   | UCP                   | Unlike Coordinated Phrase  |
| PP                              | Prepositional Phrase  | VP                    | Verb Phrase  |
| PRN                             | Parenthetical   | WHADVP                | Wh-Adverb Phrase   |
| PRT                             | Particle, for words tagged RP   | WHNP                  | Wh-Noun Phrase   |
| QP                              | Quantifier Phrase   | Х                     | Unknown, uncertain or un-<br>bracketable   |

 Table 3 NXT Non-Terminal (nt) Sub-Category (subcat) Values (from Treebank)

| ADV     | Adverbial (other than ADVP or PP) | PRP     | Purpose or reason             |
|---------|-----------------------------------|---------|-------------------------------|
| DIR     | Direction                         | PRP,TPC | Topicalised purpose or reason |
| IMP     | Imperative                        | PUT     | Locative complement of put    |
| LOC     | Locative                          | SBJ     | Surface subject               |
| LOC,PRD | Locative predicate                | SBJ,UNF | Unfinished Surface Subject    |
| MNR     | Manner                            | SEZ     | Reported speech               |
| NOM     | Nominal (on relatives and         | TMP     | Temporal                      |
|         | gerunds)                          |         |                               |
| NOM,TPC | Topicalised Nominal               | TMP,UNF | Unfinished Temporal           |
| PRD     | Predicate (other than VP)         | TPC     | Topicalised                   |
| PRD,PRP | Purpose or reason predicate       | UNF     | Unfinished                    |
| PRD,UNF | Unfinished Predicate              |         |                               |

pointer. The syntactic category ('cat') and sub-category ('subcat') of non-terminals ('nt') are attributes. Note that turns have as children whole syntactic parses, which can include multiple clauses (in this case starting before and ending after the extract in Figure 4). Disfluencies have two child elements, a 'reparandum' and a 'repair', each of which has a 'word' child.



#### 3.4 Dialog Acts

Dialog acts are categories of utterances much like speech acts, but drawing more on natural conversational phenomena, for example representing various acts of grounding such as backchannel responses, appreciations, and answers to questions. Jurafsky et al. (1997) annotated each utterance (slash-unit) in these same 1126 Switchboard conversations for dialogue 
 Table 4
 NXT Dialog Act (da) Type Values

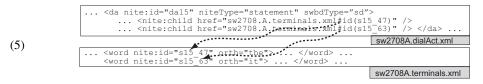
\_

| NXT                 | SWBD-<br>DAMSL | Description   | Example                       |
|---------------------|----------------|---|-------------------------------|
| abandon             | %-             | Adandoned or Turn-Exit                                | So, -/                        |
| acknowledge         | bk             | Response Acknowledgment                               | Oh, okay.                     |
| affirm              | na,ny^e        | Affirmative non-yes answers                           | It is.                        |
| agree               | aa             | Agree/Accept  | That's exactly it.            |
| ans_dispref         | arp,nd         | Dispreferred answers                                  | Well, not so much that.       |
| answer              | no             | Other answers   | I don't know.                 |
| apology             | fa             | Apology   | I'm sorry.                    |
| apprec              | ba             | Appreciation  | I can imagine.                |
| backchannel         | b              | Backchannel   | Uh-huh.                       |
| backchannel_q       | bh             | Backchannel as question                               | Is that right?                |
| close               | fc             | Conventional-closing                                  | It was nice talking to you.   |
| commit              |                | -   | I'll have to check that out.  |
|                     | 00,cc,c0<br>^2 | Offers, Options & Commits<br>Collaborative Completion | or not.                       |
| completion          | =              | -   |                               |
| decl_q<br>directive | qw^d           | Declarative Wh-Question<br>Action-directive           | You are what kind of buff?    |
|                     | ad             |   | Why don't you go first        |
| downplay            | bd             | Downplayer  | That's all right.             |
| excluded            | @              | Excluded - bad segmentation                           | -                             |
| hedge               | h<br>^1        | Hedge   | Well, I don't know.           |
| hold                | ^h             | Hold before response                                  | I'm drawing a blank.          |
| maybe               | aap/am         | Maybe/Accept-part                                     | Something like that.          |
| neg                 | ng,nn^e        | Negative non-no answers                               | Uh, not a whole lot.          |
| no                  | nn             | No answers  | No.                           |
| open                | fp             | Conventional-opening                                  | How are you?                  |
| open_q              | qo             | Open-Question   | How about you?                |
| opinion             | SV             | Statement-opinion                                     | I think it's great.           |
| or                  | qrr            | Or-Clause   | or is it more of a company?   |
| other               | o,fo,bc        | Other   | I tell you what.              |
|                     | by,fw          |   |                               |
| quote               | ^q             | Quotation   | [I said] "Okay, fine"         |
| reject              | ar             | Reject  | Well, no.                     |
| repeat              | b^m            | Repeat-phrase   | Oh, fajitas.                  |
| repeat_q            | br             | Signal-non-understanding                              | Excuse me?                    |
| rhet_q              | qh             | Rhetorical-Questions                                  | Who has time?                 |
| self_talk           | tÎ             | Self-Talk   | What is his name?             |
| statement           | sd             | Statement-non-opinion                                 | He's about five months old.   |
| sum                 | bf             | Summarize/Reformulate                                 | So you travel a lot.          |
| tag_q               | ^g             | Tag-Question  | Right?                        |
| thank               | ft             | Thanking  | Hey thanks a lot.             |
| third_pty           | t3             | 3rd-party-talk  | Katy, I'm on the phone.       |
| uninterp            | %              | Uninterpretable                                       | But, uh, yeah.                |
| wh_q                | qw             | Wh-Question   | Well, how old are you?        |
| yes                 | ny             | Yes answers   | Yes.                          |
| yn_decl_q           | qy^d           | Declarative Yes-No-Question                           | You just needed a majority?   |
| J                   | 1/ 4           | 2 commune rep rio Question                            | 20 million needed a majority. |

acts using a new tagset they called SWBD-DAMSL. They used a large set of combinable tags resulting in 220 combination tags, which they then clustered into 42 dialog act tags shown in Table 4 (as many tags were very infrequent, similar less frequent tags were clustered together, see Jurafsky et al., 1998). Both the SWBD-DAMSL tag names and the given NXT glosses are included in the data.

As we'll discuss later, the dialog act transcripts don't exactly match the standard Penn Treebank 3 transcripts, because Jurafsky et al. (1997) annotated an early version of the Penn Treebank 3 transcript, after the LDC had done the utterance segmentation, but in parallel with LDC's parsing of the corpus. Some corrections to mistranscriptions in both projects meant that the transcripts for the Treebank3 release and the Jurafsky et al. (1997) corpus have minor word differences.

In summary, **dialog acts**, e.g. *statement*, *question*, are included in the NXT-format Switchboard Corpus based on the Treebank3 transcript. An extract of the XML representation of dialog acts ('da') is given below. The dialog act type in NXT is given in the attribute 'nite-Type', and the original SWBD-DAMSL type in the attribute 'swbdType'. Note that this dialog act has more children than are shown, for space reasons we only give the first and last words in the utterance from Figure 4.



#### 3.5 Markables: Animacy, Information Status and Coreference

The 642 conversations in the Treebank3 included in the NXT-format Switchboard Corpus were further annotated for animacy (Zaenen et al., 2004) and 147 for information status (Nissim et al., 2004). As animacy and information status are properties of entities, only NPs and pronouns were marked. Disfluent speech and locative, directional, and adverbial NPs were excluded.

Animacy annotation captures the inherent accessibility of entities. Entities were marked according to widely used categories of animacy that make up an 'animacy scale', as shown in Table 5 and further described in Zaenen et al. (2004).

Information status annotation captures the accessibility of entities in a discourse, drawing on the well-known hierarchy of Prince (1992). NPs that had been previously mentioned, along with generic pronouns, were classified as *old*. NPs which had not been mentioned but were generally known or inferable were *med* (mediated). NPs which had not been mentioned and were not mediated were *new* (see Table 6). Old and mediated entities could be further classified according to a subtype, which specified how they got their old or mediated status, e.g. identity, event, situation; see Tables 7 and 8 (for more details see Nissim et al., 2004). For old entities, a *co-reference* link was also marked between references to the same entity, specifying the *anaphor* and the *antecedent*.

In summary, the following features of NPs are included in the NXT-format Switchboard Corpus based on the Treebank3 transcript:

**Animacy:** Coding of NPs for animacy status, e.g. *human, animal, non-concrete* (as an attribute on the *markables*).

## Table 5 NXT Markable Animacy Values (from Zaenen et al., 2004)

| human        | Refers to one or more humans; this includes imaginary entities that are presented as human, e.g. gods, elves, ghosts |
|--------------|--|
| org          | Collectivities of humans when displaying some degree of group identity   |
| animal       | Non-human animates, including viruses and bacteria   |
| mac          | Intelligent machines, such as computers or robots  |
| veh          | Vehicles   |
| place        | Nominals that "refer to a place as a place", e.g. at my house  |
| time         | Expressions referring to periods of time   |
| concrete     | "Prototypical" concrete objects or substances, e.g. body parts; excluded   |
|              | are things like air, voice, wind and other intangibles   |
| nonconc      | The default category; used for events, and anything else that is not pro-  |
|              | totypically concrete but clearly inanimate   |
| oanim        | Coder unsure of animacy status   |
| mix₋an       | Mixed animacy status   |
| anim_uncoded | Animacy status uncoded   |

 Table 6
 NXT Markable Info Status Values (from Nissim et al., 2004)

| old            | Entity has been mentioned before, or is generic (see examples in Ta- |
|----------------|--|
|                | ble 7)   |
| med            | Not mentioned before, but can be inferred from previous discourse or |
|                | general knowledge (see examples in Table 8)                          |
| new            | Newly mentioned and not inferable                                    |
| status-uncoded | Information status uncoded   |

 Table 7 NXT Markable Old Info StatusType Values (from Nissim et al., 2004)

| ident         | Anaphoric reference to a previously mentioned entity, e.g. I met M. He's |
|---------------|--|
|               | a nice guy   |
| relative      | Relative pronoun   |
| generic       | Generic pronoun, e.g. in holland they put mayo on chips                  |
| ident_generic | Generic possessive pronoun, e.g. in holland they put mayo on their       |
|               | chips  |
| general       | I and you  |
| event         | Reference to a previously mentioned VP, e.g. I like going to the moun-   |
|               | tains. Yeah, I like <b>it</b> too  |
| none          | Sub-category not specified   |

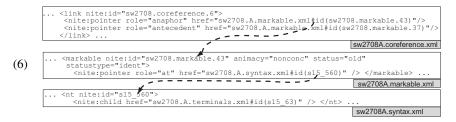
**Information Status:** Coding of NPs as *old, mediated* or *new*, plus sub-types of *old* and *mediated* (as an attribute on the *markables*).

**Coreference:** Links between each *anaphor* (i.e. NP marked as *old-identity* and its *antecedent* (i.e. its previous mention in a conversation).

| bound       | Bound pronoun, e.g. everyone likes his job                                 |
|-------------|--|
| general     | Generally known, e.g. the sun  |
| event       | Relates to a previously mentioned VP, e.g. We were traveling around        |
|             | Yucatan, and the bus was really full                                       |
| aggregation | Reference to previously mentioned co-ordinated NPs, e.g. John Ann          |
|             | they   |
| func_value  | Refers to the value of a previously mentioned function, e.g. in centi-     |
|             | grade between zero and ten it's cold                                       |
| set         | Subset, superset, or member of the same set as a previously mentioned      |
|             | entity   |
| part        | Part-whole relation for physical objects, both intra- and inter-phrasal,   |
|             | e.g. when I come home my dog greets me at the door                         |
| poss        | Intra-phrasal possessive relation (pre- and post-nominal) that is not part |
| situation   | Part of a situation set up by a previous entity, e.g. capital punishment   |
|             | the exact specifications   |
| none        | Sub-category not specified   |

 Table 8
 NXT Markable Mediated Info StatusType Values (from Nissim et al., 2004)

An extract of the XML representation of 'markables' and 'coreference' is shown in (6). The 'markable' element has attributes showing the 'animacy' type, information 'status' and information status sub-type ('statustype'). Markables point at NPs (an 'nt', note the child of this 'nt' is the word *it*, as shown in (5)). Coreference elements have two pointers, to the 'anaphor' and the 'antecedent', both of which are 'markables' (note only one is shown here).



#### 3.6 Kontrast and Triggers

A total of 145 conversations from the set annotated for information status have also been annotated for kontrast (focus/contrast). While focus-marking has been extensively discussed in both the semantics literature (e.g. Halliday, 1968; Rooth, 1992; Selkirk, 1995; Steedman, 2000) and the intonational phonology literature (e.g. Pierrehumbert and Hirschberg, 1990; Ladd, 2008), there have been few attempts to annotate focus in corpora. Most existing studies use a rather restrictive definition of focus, as being either new information or an explicit contrast in the context (e.g. Nakatani et al., 1995; Hedberg and Sosa, 2001; Zhang et al., 2006) (though see Buráňová et al., 2000). We have used a much broader notion of focus, based on the widely-accepted Alternative Semantics definition (Rooth, 1992). We call focus under this definition *kontrast*, following Vallduví and Vilkuna (1998), to distinguish our usage from other definitions of focus in the literature and the common usage of *contrast* which

#### Table 9 NXT Kontrast Type Values

| correction  | Corrects or clarifies another word or NP just used by either speaker, e.g. <i>now are you sure they're</i> <b>hyacinths</b> <i>, because that is a bulb.</i>    |
|-------------|---|
| contrastive | Intended to contrast with another word mentioned in the context, e.g. <i>I</i> have got some in the <b>backyard</b> that bloomed blue <i>I</i> would have liked |
|             | those in the <b>front</b> . A trigger marks the link between backyard and front.  |
| subset      | Highlights one member of a more general set that has been mentioned   |
|             | and is a current topic, e.g. this woman owns three day cares she had  |
|             | to open the second one up because her waiting list was a year long!   |
|             | Again, a trigger links the set (day cares) and the subset (the second   |
|             | one).   |
| adverbial   | A focus-sensitive adverb, i.e. only, even, always, especially, just, also   |
|             | or too is used to highlight the word, and not another in a plausible set,   |
|             | e.g. (A) I thought [Michael J Fox] was crummy in 'The Hard Way'. (B)  |
|             | I didn't even like the previews on that. A trigger linked the adverb and  |
|             | kontrast.   |
| answer      | Fills an open proposition set up in the context such that it would make   |
|             | sense if only that word or phrase were spoken, e.g. (A) [these] blooms  |
|             | I'm not sure what they are they come in all different colors (B) I'm  |
|             | going to bet you that is a LILY.  |
| other       | Clearly kontrastive, but not one of the other types, used sparingly.  |

Table 10 Distribution of kontrast types at the word and NP level (frequencies exclude non-applicables).

| Туре        | Word   | NP   | Freq   | Туре           | Word  | NP  | Freq  |
|-------------|--------|------|--------|----------------|-------|-----|-------|
| Contrastive | 6823   | 1885 | 7.8%   | Answer         | 196   | 116 | 0.3%  |
| Other       | 6166   | 1544 | 6.9%   | Correction     | 169   | 54  | 0.2%  |
| Subset      | 5037   | 2273 | 6.6%   | Background     | 91856 | n/a | 82.7% |
| Adverbial   | 1798   | 160  | 1.8%   | Non-Applicable | 13325 | n/a | -     |
| Total       | 124440 | 6962 | 111115 |                |       |     |       |

might imply only explicit contrasts. To our knowledge, there have been no other attempts to annotate foci using this definition in unrestricted speech; so our scheme is novel.

Annotators identified words or NPs which were "salient with an implication that this salience is in comparison or contrast to other related words or NPs explicitly or implicitly evoked in the context"; that is, explicitly using the alternative semantics definition. However, annotators did not mark kontrast directly. Instead, words or NPs were marked according to their *kontrast types* (based on Rooth, 1992), see Table 9; with all other words being *background*. A decision tree was used where more than one category applied; this ranked kontrast types according to their perceived salience in different sentential contexts (for full details see Calhoun, 2005, 2006, ch. 5). It was felt that this indirect approach was more natural and immediately comprehensible to both annotators and other eventual users of the corpus. In certain categories, annotators also marked a *trigger* link between the kontrast and the word that motivated its category assignment (see Table 9). Table 10 shows the overall distribution of kontrast annotation types.

Only certain words were annotated, i.e. nouns, verbs, adjectives, adverbs, pronouns and demonstratives in full sentences. This was done to improve the efficiency of the annotation, as it was thought these words would be most likely to be genuinely kontrastive. Further, annotators were instructed to mark false starts, hesitations and idiomatic phrases such as "in fact" or "you know" as *non-applicable*; as Alternative Semantics theory did not seem to cover such cases. Annotators could listen to the conversation (but not see acoustic information). We felt this was important to identify actual kontrasts intended by the speaker, rather than all potential kontrasts, given the highly ambiguous nature of spoken spontaneous discourse.

Annotations were done by two post-graduate linguistics students at the University of Edinburgh. Annotators were given fairly extensive training, after which they reported that they understood and felt confident about their task. Agreement was measured on three conversations at different stages of the project using the kappa statistic (Siegel and Castellan, 1988). In all cases, annotators did two passes of each conversation, i.e. they checked their own annotations once. "Blind" kappa agreement, i.e. without discussion, over all kontrast types was  $\kappa = 0.67$ , and  $\kappa = 0.67$  for the binary distinction between kontrast and background (k = 2, n = 3494). Given the level of confidence of the annotators, this was lower than hoped, but is not unusual. Being a new task, it is difficult to know what a "good" score is. Therefore we also measured an "agreed" figure: in each case where the annotators disagreed, each explained to the other the reason for the type they chose; where they could both then agree that one type was better (with reference to the guidelines and decision tree), the other changed their annotation. Both annotators were considered equals. "Agreed" kappa over all kontrast types was  $\kappa = 0.85$ , and  $\kappa = 0.83$  for the kontrast/background distinction (k = 2, n = 3494). This could be considered an "upper bound" on annotator agreement for this task, at least using the current definitions.

Two particular sources of annotator disagreement were identified. One was caused by the varying scope of kontrast. Annotators were able to mark kontrast at the word or NP level. It was decided it would be too difficult to maintain consistency if the size of kontrast elements were unrestricted. Therefore, when the kontrast appeared to be larger than the NP, annotators were instructed to mark the word or words which sounded most salient. This led to conflicts about salience which did not actually stem from disagreement about kontrast status. This issue is difficult to resolve, and in fact Carletta (1996) notes that segmentation is one of the most challenging aspects of discourse annotation, and may make certain tasks inherently more uncertain than others, such as clause boundary identification. We also found disagreement where one or more kontrast type plausibly applied, but one analysis or the other was not noticed by one of the annotators for the "blind" comparison, or then accepted for the "agreed" comparison. For research purposes so far considered, we consider such discrepancies in annotation minor provided that each such case was annotated as some sort of kontrast (i.e. not background). More problematic were the fairly common disagreements between other and background. Overall, we decided it was better to keep the category, because of the many cases which were clearly kontrastive, but did not fit in one of the other types. The annotators' difficulty does vindicate our decision not to annotate kontrast per se, however. In general, the annotations were reasonably successful, given the lack of precedent for annotating focus in spontaneous English conversation. Further development of such a standard will want to look again at the issue of kontrast scope and the status of other.

In summary, the following features of content words are included in the NXT-format Switchboard Corpus based on the Treebank3 transcript:

**Kontrast:** Coding of words for whether they have a salient alternative in the context (*kontrast*), or not (*background*). Kontrast was marked according to a number of types, e.g. *contrastive, subset, answer*.

**Trigger:** Links certain kontrasts to the word(s) that motivated their marking.

An extract of the XML representation of 'kontrasts' and 'triggers' are shown below. The 'type' of the kontrast, and the 'level' at which it was marked (word or NP), are attributes of the 'kontrast' element. 'Triggers' had two pointers, a 'referent', which pointed at the main kontrast, and a 'trigger', which pointed at the element which motivated the kontrast marking (not shown here). For ease of comprehension, the context of this example is given in (7). The conversation is about who should pay for the prison system, the child of sw2708.kontrast.48 is *government* (cf. (2)), and the child of sw2708.kontrast.48 is *business* (XML links to words not shown below).

(7) they're talking about having it [the prison system] as a business... so...

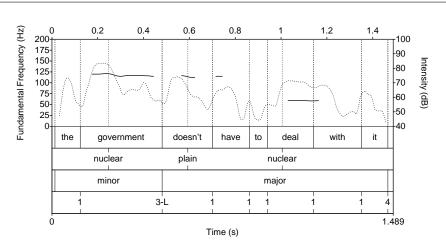
| th  | e government doesn't have to deal with it.  |   |
|-----|---|---|
|     | <pre> <trigger nite:id="sw2708.trigger.3"></trigger></pre>  | role="referent" /><br>role="trigger" /> |
| (8) |   | sw2708A.trigger.xml                     |
|     | <pre> <kontrast level="word" nite:id="sw2708.kontrast.48" type="contras&lt;/th&gt;&lt;th&gt;tive"><br/>ast&gt;</kontrast></pre> |   |
|     |   | sw2708A.kontrast.xml                    |

#### 3.7 Prosody: Accents, Phrases and Breaks

The NXT-format Switchboard Corpus includes simplified ToBI prosody annotation of 45 complete conversations (definitions below). It also includes conversations which were annotated by us according to ToBI-like standards with some modifications: 18 of these are complete conversations, while in 13 further only sentential clauses containing kontrastive words were annotated (the majority). There are some other existing prosodic annotations for Switchboard Corpus data (Taylor, 2000; Yoon et al., 2004), however, we have not tried to include these as they are of isolated utterances, which are not useful for dialogue analysis. Below we describe each prosodic annotation set, and then how these are represented in NXT Switchboard.

The 45 conversations with simplified ToBI markup were annotated for prosody by Ostendorf et al. (2001), based on the MS-State transcript. These are identified as the "UW [University of Washington] prosody" annotation set. Accents and phrase breaks were annotated using simplified To(nes) and B(reaks) I(ndices) (ToBI) labels (Beckman and Hirschberg, 1999). Annotators labeled a break index tier, identifying 0, 1, 1p, 2, 2p, 3, 4 and X breaks (broadly higher indices show greater break strength, 'p' is disfluent, 'X' is uncertain break index); and a tone tier, labeling L-, H- and X (low, high and uncertain) phrase accents at 3 breaks, as well as L%, H% and X% boundary tones at 4 breaks. At 3 breaks, they could also use !H- phrase accents for a mid-range pitch fall after a high accent ('!' indicates downstepped). A question mark after the tone label indicated the annotator was unsure of their classification. In an accent tier, accents were identified using a \*, or \*? for a weak accent. Tonal pitch accent type was not labeled.

Our prosody annotation scheme was also based on the ToBI standards. We have, however, made certain changes to concentrate on features which were most important for our research questions, and were useful generally (for full details see Brenier and Calhoun,



**Fig. 3** Example *Praat* textgrid and acoustic display of the prosody annotation (part of the utterance from Figure 4). The fundamental frequency track (solid line) and intensity curve (dotted line) are shown, along with the phonword transcript, the accent annotation (accent type marked), the phrase annotation (type marked), and break annotation (break index and phrase tone marked).

2006; Calhoun, 2006, ch. 5). As well as marking the presence of accents, in our scheme, one accent in each fluent phrase was identified as *nuclear*. As far as we are aware, this feature is unique among available corpora. However, nuclear accents have long been claimed to have important properties distinct from other accents (Crystal, 1969; Liberman, 1975; Ladd, 2008). The nuclear accent is a compulsory part of a well-formed phrase, while the presence of other accents varies depending on rhythm, length and emphasis. Further, it has often been claimed that nuclear accents, not accents in general, mark focus (see Ladd, 2008). The nuclear accent was defined as the most *structurally* prominent, normally the right-most one, not necessarily the most *phonetically* prominent (Ladd, 2008). After some discussion and practice, the annotator was able to use this concept effectively. There were a few difficult cases, particularly in phrases with an early emphatic high accent and a later, lower nuclear accent. We therefore introduced a *pre-nuclear* marker for the first accent in such cases; this was used rarely, however. Non-nuclear accents could be marked as either *weak* or *full*, to cover cases in which the cues to accenting were mixed. Tonal accent type was not marked.

Rather than marking a break index after every word, as in ToBI, in our scheme, words were grouped into prosodic phrases, and then each phrase was marked as being one of four types. Unified phrases were felt to be more useful for the investigation of the relationship between discourse functions and phrasing than sequential break indices. Fluent phrases could be either *minor* (ending in ToBI break index 3) or *major* (ending in break index 4). As in ToBI, the distinction was based on the perceived degree of disjuncture, as well as the tonal movement at the boundary. Phrase breaks that sounded disfluent, e.g. cut-offs before restarts, repetitions or hesitations, were marked *disfluent* (equivalent to ToBI 1p and 2p). Short phrases containing only discourse fillers, e.g. *um*, *you know*, with no tonal movement, were marked *backchannel* (ToBI X). An example *Praat* textgrid and acoustic display (Boersma and Weenink, 2006) showing the prosody annotation are given in Figure 3. As can be seen, 'accents' mark points of prosodic prominence (marked primarily with intensity by this speaker), 'phrases' prosodic groupings of words, and 'breaks' the degree of juncture after each word.

 Table 11 Distribution of accent and phrase types using our annotation scheme (Ed original/Ed converted sets).

| Accent           | Freq  |         | Phrase      | Freq  |         |
|------------------|-------|---------|-------------|-------|---------|
| Nuclear          | 25.8% | (12322) | Minor       | 11.1% | (5269)  |
| Pre-Nuclear      | 0.3%  | (156)   | Major       | 15.0% | (7119)  |
| Full Non-Nuclear | 11.1% | (5340)  | Disfluent   | 1.6%  | (783)   |
| Weak Non-Nuclear | 3.6%  | (1710)  | Backchannel | 1.8%  | (871)   |
| Unaccented       | 59.1% | (28207) | No Break    | 70.5% | (33537) |
| Total            |       | 47735   | Total       |       | 47579   |

In all, 31 Switchboard conversations have been annotated for prosody using our scheme. Of these, we annotated 13 from scratch (designated as the "Ed [University of Edinburgh] original prosody" annotation set), and only included words in sentential clauses which had also been annotated for kontrast (see above), as these were intended to form a complementary set. The remaining 18 conversations (designated as the "Ed converted" annotation set) were annotated by manually converting the annotations on conversations that had already been marked up using the annotation scheme of Ostendorf et al. (2001). This approach made use of the existing data and was more efficient than starting from scratch. As well as converting the annotations, the annotator corrected anything with which they disagreed. Unlike the 13 conversations annotated from scratch, in these conversations all words were marked, as they had been in the originals. Most of the annotations and conversions were done by a post-graduate linguistics student at the University of Edinburgh with experience using ToBI, and a small number (3) by the first author. Annotations were carried out for each conversation side separately on the MS-State transcript using Praat (Boersma and Weenink, 2006), and then later moved to NXT format. Table 11 shows the overall distribution of accent and phrase types.

One conversation side was used to check agreement between our annotator and the first author. This comparison was "blind", i.e. the annotators had no access to each other's annotations before agreement was measured. Kappa agreement on the presence or absence of a phrase break following each word was  $\kappa = 0.91$ , and on phrase break type was  $\kappa = 0.89$  (k = 2, n = 752). Agreement on the presence or absence of an accent, and on accent type, was  $\kappa = 0.80$  (k = 2, n = 752). These scores are high enough that the research community would accept them without question. They are also commensurate with those reported for previous ToBI annotation projects (Pitrelli et al., 1994; Yoon et al., 2004), suggesting the changes made in our scheme were successful. There is little difference in kappa for all types versus presence/absence (±), showing good discrimination between types.

All prosody annotations just described are represented in NXT using three elements: accents, phrases and breaks. Because of the differences in the way our three sets of source files (UW, Ed original and Ed converted) were annotated, there are slight differences in how these elements are generated for each set. However, we have generated a full set of all three elements for all conversations annotated. In this way, the NXT representation retains most of the information in the originals, while the entire set of 76 conversations annotated for prosody can be searched as a set. Because of the considerable annotator time and expense needed, it was not possible to annotate all conversations according to both prosody annotation schemes, so that all the source material was uniform; should that even be desirable.

For all three sets of annotations, accents are represented at the time marked in the original annotation in the NXT representation. All accents have a strength attribute, *weak* versus

| Element | Attribute              | Values                               |
|---------|------------------------|--------------------------------------|
| accent  | strength               | weak, full                           |
|         | type (Ed only)         | nuclear, plain                       |
| phrase  | type                   | minor, major, disfluent, backchannel |
| break   | index (Ed)             | 3, 4, 2p, X                          |
|         | index (UW)             | Full ToBI break index (1-4, p, X)    |
|         | phraseTone (UW only)   | L, H, !H, X (+ ? variant)            |
|         | boundaryTone (UW only) | L, H, X (+? variant)                 |

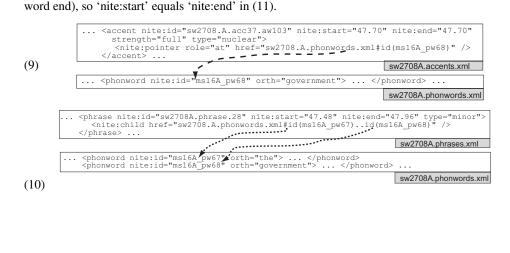
Table 12 NXT Accent, Phrase and Break Attributes and Values

full (\*? versus \* in the UW annotation); the Ed original and converted conversations also have a type attribute, nuclear versus plain (see Table 12). An NXT pointer marks the word that accent associates with: in the Ed sets, this was marked by the annotators; for the UW set, the word association was derived automatically from the word timings. The two annotation schemes marked prosodic boundaries differently: in the Ed scheme as phrases, i.e. words grouped into prosodic phrases; in the UW scheme as breaks, i.e. the degree of juncture after each word. As each contained slightly different information, and different users may find either breaks or phrases more useful, it was decided to include both breaks and phrases in the NXT representation (see Table 12). It is anticipated that users will use one or the other. For the Ed sets, phrases were derived directly from the manual annotation. For the UW set, phrases were generated automatically using the locations of higher-level break indices (3, 4, 2p, 3p or X). As the information about break indices in the UW annotations was richer than the Ed break index information, breaks were generated from the original UW annotations where these existed. Breaks point at the word they fall after, and include the break index, and associated phrase tone and boundary tone, if there are any. For the Ed original conversations only, breaks were derived automatically from phrases, so only 2p, 3, 4, and X breaks are marked; and there are no phrase or boundary tones.

In summary, the following prosodic features are included in the NXT-format Switchboard Corpus based on the MS-State transcript:

- Accent: Pitch accents (*weak* or *full*), marked at the time of the peak and associated with words. Word association was marked manually for the Ed sets, automatically for the UW set. Accent type is given for the Ed sets (*nuclear* or *plain*).
- **Phrase:** Groupings of words into prosodic phrases by type (*minor*, *major*, *disfluent*, *backchan-nel*); marked manually for the Ed sets, determined automatically from the manual ToBI break marking for the UW set.
- **Breaks:** ToBI break indices, phrase and boundary tones, derived from UW annotations. For the Ed original set, generated automatically from the phrases, so only 2p, 3, 4 and X breaks marked and phrase/boundary tones not included.

An extract of the XML representation of 'accents' is shown in (9), 'phrases' in (10) and 'breaks' in (11). Accents are marked at a single point of time (usually the pitch peak), this is represented by having the 'nite:start' and 'nite:end' times the same. The accent 'strength' and 'type' are attributes. Note that accents point at 'phonwords' (MS-State transcript). Phrases have 'phonword' children, while 'breaks' point at the 'phonword' they follow (note the break in (11) points at the 'phonword' government, shown in (10)). Breaks have attributes showing the break 'index', and optionally, the 'phraseTone' and 'boundaryTone'



(note (11) does not have the latter). Breaks are also marked at a single point in time (the

#### 3.8 Phones and Syllables

Finally, automatically derived phone and syllable annotation layers have been added for all 642 conversations in the NXT-format Switchboard Corpus, based on the MS-State transcript. Although a small set of Switchboard utterances have been hand-transcribed phonetically (Greenberg et al., 1996), this set was drawn from independent utterances from many different conversations, and hence did not comprise any complete conversations. Thus we have automatically derived phone and syllable identity and timings for our entire corpus. Firstly, using the whole Switchboard Corpus, acoustic triphone models were trained with *Sonic*, the University of Colorado continuous speech recognition system (Pellom, 2001). Next, these models were used to generate forced phone alignments from the MS-State transcript's word start and end times. The resulting phone sequences were automatically parsed into syllables using NIST syllabification software (Fisher, 1997), and each syllable was assigned a stress level (*primary, secondary*, or *unstressed*) using the CMU pronunciation dictionary (Weide, 1998). Automatic phone and syllable alignment technology is fairly mature, so this information could be derived with reasonable efficacy.

In summary, the following sub-lexical features are included in the NXT-format Switchboard Corpus based on the MS-State transcript:

- **Syllables:** Automatically derived syllables, including stress information (*primary*, *sec-ondary* or *none*).
- Phones: Automatically derived phones, includes the start and end time for each phone.

An extract of the XML representation of 'syllables' and 'phones' ('ph' elements) is shown below. Timing information is included on the 'phone' and 'phonword' levels, this can be used to get the timing on the 'syllable' level. The 'stress' on each syllable is an attribute (n

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= no stress, p = primary, s = secondary). This is used to generate the 'stressProfile' attribute on the 'phonword', i.e. a list of the stress information for all its syllable children (also see (1)).

|      | <pre> <phonword nite:id="ms16A_pw67" orth="the" stressprofile="n"></phonword></pre>                                 |                       |  |  |  |
|------|---|-----------------------|--|--|--|
| (12) | <pre> <syllable nite:id="ms67A_syl" stress="n"></syllable></pre>  |                       |  |  |  |
|      | ٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠٠  | sw2708A.syllables.xml |  |  |  |
|      | <pre> <ph nite:end="47.&lt;/th&gt;&lt;th&gt;53" nite:id="ms102A ph1" nite:start="47.48">dh</ph><br/>61"&gt;ah</pre> |                       |  |  |  |
|      |   | sw2708A.phones.xml    |  |  |  |
|      |   | sw2708A.phones.xr     |  |  |  |

In addition to these layers, there are NXT 'corpus resource' files representing information about the topics and speakers for the dialogues.

#### 4 Corpus Overview and Use

All of the annotations described above are represented in different layers of annotation in NXT, and the relationships between them faithfully represented using NXT parent/child and pointer relationships (see section 3.1). Here, we give an overview of the overall structure of the corpus, and a small example of how it can be queried using NXT tools.

Figure 4 shows a simplified example of the resulting structure drawn from the corpus (note this uses the same example as in the preceding sections). Not all annotations cover the entire corpus. Figure 5 shows the number of Switchboard conversations with each type of annotation.

One principal advantage of our corpus is that it allows all of the annotations to be searched as a set. NXT's query language (NQL, Carletta et al., 2005) allows search for n-tuples of nodes from the graph structure where the variable bindings can be constrained by type and filtered using boolean combinations of conditions that express either restrictions on a node's attribute values or temporal and structural relationships between pairs of nodes.

For instance, it is often said that in English 'new' information is accented while 'given' information is not. Evidence from controlled experiments and restricted domain speech (such as map tasks) shows that the situation is more complex than this (e.g. Terken and Hirschberg, 1994; Bard et al., 2000). However, to our knowledge, this has not been tested in a large scale corpus of unrestricted speech. This can be done easily in the NXT-format Switchboard Corpus. The analyst must first identify a query that specifies how to pull out pairs of 'markables' coded for information status and accents that go together (note that NXT provides graphical interfaces to assist with this, see http://groups.inf.ed.ac.uk/switchboard/start.html). These variables are not directly related in the NXT corpus structure (see Figure 4), so the query must specify the path between these two layers of annotation, i.e. markables point at noun phrases that contain some orthographically transcribed word(s), and the accent points at the corresponding phonetic word ('phonword'):

```
($m markable)($nt nt)($w word)($pw phonword)($a accent):
\\RETURN MARKABLE, NT, WORD, PHONWORD and ACCENT 5-tuples
($m > $nt) &&
\\WHERE THE MARKABLE POINTS AT A NON-TERMINAL (NT)
($nt ^ $w) &&
\\AND THAT NT IS THE PARENT OF A WORD
```

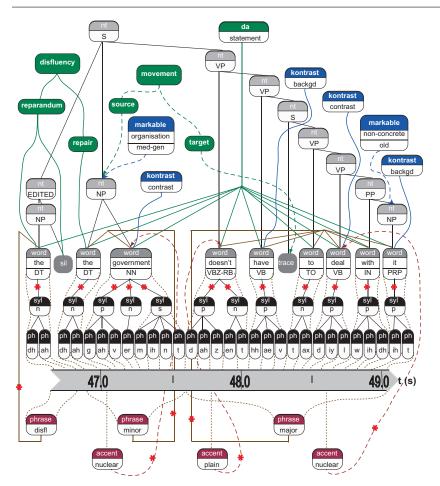


Fig. 4 Overview of annotations from a small sample of the Switchboard Corpus as represented in the NXT data model. Individual nodes may have multiple attributes; for simplicity, we show just the values of the most important ones. Parent/child relationships are shown by solid lines, pointers by dashed lines. Note that where the relationship between a word and another element is marked with a star (\*), this word in fact points at a phonword, which is directly linked to the other element (see Figure 1). Turn, coreference, trigger and break codings are not shown. See http://groups.inf.ed.ac.uk/switchboard/ for further details.

(\$w > \$pw) && \\AND THAT WORD POINTS AT A PHONWORD (\$a > \$pw) \\AND AN ACCENT ALSO POINTS AT THAT PHONWORD

This kind of query allows users to retrieve properties of words contained in annotations attached to both of the transcripts (e.g. markables and prosody). However, the results returned will fail to cover unaligned segments of one or other transcription. The NXT-format Switchboard Corpus thus allows all the same investigations as the components from which it was created, but makes it easier to do research that uses several kinds of annotation, as well as to add new ones.

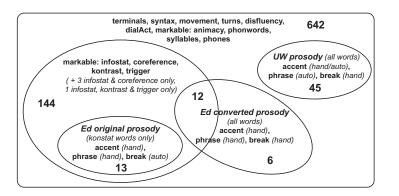


Fig. 5 Diagram showing the number of conversations in the NXT-format Switchboard Corpus release with the different layers of annotation (see http://groups.inf.ed.ac.uk/switchboard/coverage.html for a list of which conversations are in each set). Note that the information status and kontrast annotations were intended to cover the same subset. However, there are four anomalous files that are missing one or more of the relevant layers. The prosody files (accent, phrase and breaks) were generated in slightly different ways, either directly from manual annotations (hand) or automatically from other annotations (auto), and cover different numbers of words, either all words or only those also annotated for kontrast status (konstat only). These annotations, therefore, are listed according to their source: Edinburgh (Ed) original, Ed converted or University of Washington (UW). Further details of the prosody annotations are discussed in section 3.7.

The analyst would then use one of NXT's command line utilities to extract the data from the corpus (see the NXT website for details, http://groups.inf.ed.ac.uk/nxt/ nxtdoc/doccommandlinetools.xml). The utility chosen depends on the form of output the analyst requires, e.g. XML elements or plain text. For example, the 'FunctionQuery' utility pulls out specified attributes of entities that were matched in the query, such as the orthography of the word (\$w@orth), the markable's information status (\$m@status), and the accent type (\$a@type), and returns them in plain text tab-delimited format, like the following (for details on the code to run this utility see http://groups.inf.ed.ac.uk/ switchboard/start.html):

| \$w@orth     | \$m@status | \$a@type |  |
|--------------|------------|----------|--|
| <br>business | med        | nuclear  |  |
| government   | med        | nuclear  |  |
| I            | old        | plain    |  |

A similar analysis would then need to be performed to obtain information about unaccented cases (note an extra condition, that the 'phonword' has a 'phrase' parent, would need to be added to ensure the word is prosodically annotated, see section 3.7). A collation of the results of applying this analysis to the 25 conversations annotated for both information status and accenting (including accent type, i.e. nuclear/non-nuclear) is shown in Table 13. It seems that the majority of both 'new' and 'old' words in NPs are unaccented. 'Mediated' and 'New' words are more likely to carry nuclear accents, but not non-nuclear accents. A full research project looking at this issue may also wish to look at sub-types of 'old' and 'mediated', how long since the last mention for 'old' words, or filter the results by the syntactic position of the word; all of which are possible with the NXT-format Switchboard Corpus.

| Accent Type |        |         |             |         |         |         |       |
|-------------|--------|---------|-------------|---------|---------|---------|-------|
| Info Status | s None |         | Non-Nuclear |         | Nuclear |         | Total |
| Old         | 3528   | (66.5%) | 883         | (16.7%) | 891     | (16.8%) | 5302  |
| Med         | 6007   | (57.4%) | 1530        | (14.6%) | 2928    | (28.0%) | 10465 |
| New         | 2208   | (54.0%) | 738         | (18.0%) | 1145    | (28.0%) | 4091  |

#### **5** The Conversion Process

The development of the NXT-format Switchboard Corpus involved the conversion of the existing corpus annotations in a variety of different formats, as described in section 3, into one coherent data set. The conversion of a set of legacy resources in diverse formats into one coherent data set is always a messy process, especially when performed piecemeal over a number of years. However, we believe the process of doing this shows why using XML within the NITE framework is worthwhile, because it provides a validatable data format, GUIs and a search language. This is useful not only for end users, but during the process of data creation and annotation resolution itself. During the conversion process we identified (and were often able to fix) inconsistencies in the source data, as well to test and refine assumptions about relationships within and between annotations which are not always obvious even to its creators. The resulting XML layers could also be straight-forwardly checked for consistency and usefulness using NXT's query language.

#### 5.1 Transcription Alignment

The process of aligning the Treebank3 and MS-State transcript, i.e. creating a pointer relationship between equivalent words in the two transcripts, involved a number of stages and necessarily remains imperfect. The first stage of the alignment process involved matching words where the two transcripts were the same. After this process, 6.9% of the Treebank3 words and 7.7% of the MS-State words were unaligned. The difficulty at this stage was determining which of the words were unaligned due to actual differences between the transcripts, and which of these words should be treated as equivalent. We assumed a match if the words were the same, apart from differences in capitalization or some other minor point of orthography. We also assumed a match for different representations of filled pauses (e.g. uh versus ah-huh), disfluent or unfinished words (e.g. gov- versus govern-[ment]), and non-verbal cues like laughter. We created some equivalences which mapped more than one word to a phonword, and vice versa. These involve contractions (e.g. MS-State don't versus Treebank3 do n't), the form of reduced words (e.g. wanna versus want to), and acronyms (e.g. MS-State *IBM* versus Treebank3 I B M). Finally, we aligned corresponding gaps in the two transcripts if they only involved one or two words, even if the words were different, as manual checks suggested the timing information was correct. The transcription alignment process described here leaves 0.5% of the Treebank3 words and 2.2% of the MS-State words unaligned. To the best of our knowledge, these unaligned words represent genuine differences between the two transcripts, such as where one transcript has a word between two aligned words that the other does not.

Finally, the NXT version of the Treebank3 transcription sometimes differs in the speaker to whom a transcription segment is attributed. There were some swapped speakers for entire

Switchboard conversations, which were fixed by revised speaker tables which we took into account (Graff and Bird, 2000). In addition to these errors, however, by comparing to the MS-State transcription, we found that there were some additional swapped sentences within individual conversations as well. We used the MS-State transcription as the definitive source for information about speaker identity, and therefore corrected the speaker attribution for these swapped sentences in the Treebank3 transcript.

The lesson here is that transcription changes, even fairly minor edits, cause major difficulties for corpus representation once that corpus has multiple dependent annotations. Transcription changes are inevitable for a living corpus, but it is very expensive and timeconsuming, if it is possible at all, to update all annotations to reflect the new underlying transcript. Our parallel representation is faithful, but it is a pretty uneconomical way to store a corpus. For corpora designed entirely within the NXT framework, it is possible to specify a version for each file of annotations and the dependencies among them, providing a partial solution to this problem — if an annotation relies on an old version of the transcription or of some other annotation, then NXT can be instructed to use that old version. This allows the corpus users to migrate annotations to newer versions if that becomes scientifically necessarily, but still works in the meantime.

#### 5.2 Conversion of Penn Treebank release

Carletta et al. (2004) reports on the process by which the Penn Treebank release of transcription, syntax, and disfluency annotation was converted into a precursor of the current NXT format. The main difference between the two NXT formats was that the original did not separate transcriptions and annotations for the two speakers into different files corresponding to NXT 'agents'; although agents were part of the NXT data model at the time, separation would have provided no benefits to the originators of the conversion. This is because no word timings were available, and, therefore, the material could only be treated as written transcription without any link to audio. In addition, the precursor NXT format contained a flat list of disfluencies, whereas the current NXT format nests disfluencies hierarchically where appropriate. The previous version of the NXT format was used for a range of investigations that focused primarily on discourse and syntax, but this format has been superceded by the current one.

When the original version of the NXT-format Switchboard Corpus was created from the Penn Treebank release, data validation and checking backtranslations against the original revealed that some of the disfluencies were entirely missing from the translation. This was because the originals were missing part of the markup expected; the 'EDITED' constituent, or the 'DFL' disfluency marker, or part of the bracketing. This is understandable. The disfluency markup forms a tree crossing the Penn Treebank syntax that is difficult to validate when it is stored in the same file, but easy in NXT. As part of the conversion process, but not mentioned in Carletta et al. (2004), the missing markup was inserted to make these disfluencies complete. As a result, using NXT Switchboard may result in more disfluencies than were in the original format, depending on the parsing assumptions made.

The TreeBank E\_S and N\_S tags, used to mark end-of-utterance and end-of-incompleteutterance respectively, were not maintained in NXT Switchboard, since the information is recoverable from the parse trees in the NXT representation.

#### 5.3 Conversion of dialogue acts

In NXT Switchboard, the dialogue acts draw words derived from the Treebank3 transcription as children. However, these words are not exactly the same as in the original dialogue act distribution. For the most part, it is possible to map between these two transcriptions automatically, converting, for instance, 'can not' to 'cannot'. However, the dialogue act distribution contains representations of non-words such as laughter, noise, and comments that were not in the Treebank3 transcription, but omitted Treebank3's 'MUMBLEx' and commas, used for mumbled or unintelligible speech. In addition, the dialogue act distribution sometimes contains 'slash units' in which a speaker's turn is split between two transcribed turns, with a turn from the other speaker transcribed in between. In these cases, the Treebank3 transcription and the dialogue act distribution differ in turn order; the Treebank places the incomplete turns one after the other, with the alternate speaker's turn following them. We migrated the dialogue acts to the Treebank3 transcription by allowing an act to match the Treebank's words despite these minor differences, and ordered them according to the Treebank convention.

In addition, the dialogue act distribution contains something akin to disfluency annotation that was present in the pre-Treebank transcription, but discarded in the Treebank release: annotation for asides, coordinating conjunctions, discourse markers, explicit edits, and fillers (Meteer and Taylor, 1995). Although some of these might be considered superceded by the Treebank syntax, not all would be, and the results of using the original and the Treebank would not be entirely the same. We ignored this markup in our conversion. It would be a relatively simple matter to retrieve it and place it in a new, separate NXT hierarchy.

#### 6 Discussion

As can be seen, the NXT-format Switchboard Corpus substantially develops and improves upon existing corpus resources. The NXT framework itself enables both effective representation of all existing annotations, and efficient integration of new layers of annotation. Further, the annotation set now available is unique in its coverage of important linguistic features of dialogue, including syntax, disfluency, speech acts, animacy, information status, coreference, kontrast and prosody. NXT Switchboard is potentially of great benefit for a variety of researchers across linguistics, psychology and speech technology interested in datadriven analysis of the effect of multiple linguistic factors on spontaneous speech. To date the NXT-format corpus has been used to predict accents (Sridhar et al., 2008; Nenkova et al., 2007; Brenier et al., 2006; Calhoun, to appear, 2006, ch. 6), kontrast (Badino and Clark, 2008; Sridhar et al., 2008; Nenkova and Jurafsky, 2007; Calhoun, 2009, 2007, 2006, ch. 6) and information status (Sridhar et al., 2008; Nissim, 2006). This corpus has also proved useful to investigate syntactic variation, cued by animacy and information status (Bresnan et al., 2007), complexity (Jaeger and Wasow, 2005) and syntactic priming (Reitter, 2008; Reitter et al., 2006; Dubey et al., 2005). The corpus is particularly well suited for this since it is fully parsed, allowing easy extraction of the relevant variant cases; and the many layers of annotation allow for much more control of potential interacting factors than is usually possible with naturally occurring speech.

Performance is always a worry when working with complex data sets. It is difficult to give a general idea of NXT's speed in running queries, because so much depends on the machine and the processing being done with the data. Clearly, for some queries, NXT is slower than other query languages, but this is because it is searching relationships that cannot be expressed in them; most languages are designed for tree-structured data models, which are easier to process, and do not include any operators for quantification. NXT holds data as a graph structure in memory, which can be a limiting factor. However, earlier issues with how this design choice scales have been addressed in recent releases. Current NXT selectively loads only the data files that are required for what the user is doing. There are very few data uses that would require all of the annotations for a conversation to be loaded at the same time. Similarly, it is very rarely necessary to load multiple conversations at once instead of merely iterating over them. NXT has been used successfully for a wide range of purposes on both this and other corpora. Our experience is that really complicated linguistic analyses need to be run in batch at the command line, but that for most queries, the response times when browsing the data are sufficient.

The history of the Switchboard Corpus shows that even a single layer of annotation for a significant amount of text or speech are useful and will be sought after by those outside the research group that created it. The generous agreement of developers of all these annotations of the Switchboard corpus to make their annotations freely available should, we hope, act as a positive example for our field. Having the Switchboard Corpus and all of the associated annotations in one consistent, searchable format clearly adds value over and above that found in the individual annotations. We have shown that it is possible to convert existing annotations of a corpus into a coherent format to get maximum use out of them. However, this is far from the ideal way to put together language resources. The resulting corpus is never going to be as good as a resource that is put together in an integrated framework in the first place, because there are losses along the way, e.g. invalid data, incompatible transcriptions, ambiguities in the documentation and missing documentation.

Ideally, multiple annotations should be planned from the beginning of a project (as for example with the AMI Meeting Corpus, Carletta et al., 2006). Unfortunately, this takes long-term, coherent planning and funding beyond the resources or aims of many research groups. A good place to start in creating mutually beneficial corpus resources is to agree on a consistent and flexible data format that can be validated and is underpinned by software, like the one that underlies NXT. We recognize that NXT in its current form lacks some of the end user tools that are required, and that it has limitations - chief of which is that it is difficult for less computationally-oriented users. On the other hand, it is hard to imagine any simpler framework that will allow the kinds of novel investigations to be done that are the point of this kind of corpus in the first place. In addition, there are many common corpus creation and annotation tasks for which using NXT is now already the easiest solution. For research communities that genuinely wish to foster data re-use and the more complex analyses this enables, using and further developing NXT will in the end be simpler, and more affordable, than doing the kind of post-hoc conversion process described here. In any case, the research community has much to gain from consolidating how it stores and processes corpus data.

As should be clear, there is plenty of scope for future work: on the tools we have developed, on the new NXT-format Switchboard Corpus, and on richly annotated integrated corpora in general, whether legacy resources, new resources, or hybrids. And while we have concentrated in this closing section on lessons learned from our resource building enterprise, it is important to stress that the immediate contribution of our research is not merely a set of observations on preferred methodology, but a set of ready-to-use research resources. We have shown why the NITE XML Toolkit is a good choice for representing complex combinations of corpus annotation data, and how the new resources described in this paper can facilitate research on issues like information structure and prosody. With these resources, researchers can perform corpus studies of interactions between disparate aspects of language operating at every level from acoustic signal to discourse structure, interactions that were previously inaccessible.

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