Creating a Verb Synonym Lexicon Based on a Parallel Corpus

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Abstract
This paper presents the first findings of our recently started project of building a new lexical resource called CzEngClass, which consists of bilingual verbal synonym groups. In order to create such a resource, we explore semantic ‘equivalence’ of verb senses (across different verb lexemes) in a bilingual (Czech-English) setting by using translational context of real-world texts in a parallel, richly annotated dependency corpus. When grouping semantically equivalent verb senses into classes of synonyms, we focus on valency (arguments as deep dependents with morphosyntactic features relevant for surface dependencies) and its mapping to a set of semantic “roles” for verb arguments, common within one class. We argue that the existence of core argument mappings and certain adjunct mappings to a common set of semantic roles is a suitable criterion for a reasonable verb synonymy definition, possibly accompanied with additional contextual restrictions. By mid-2018, the first version of the lexicon called CzEngClass will be publicly available.

Keywords: Lexical Resource, Parallel Corpus, Semantics, Syntax, Synonymy, Valency

1. Introduction

While synonym lexicons, such as the Roget’s thesaurus (Associates, 1988) or WordNet (Miller, 1995) are well-known resources, used in both research and NLP applications, we believe that there is a significant gap in these resources (which concerns mainly verbs). We see two orthogonal problems: first, a granularity problem—current synonym classes (synsets, entries, frames, ...) as found in these resources are usually too broad (contain words which can be considered synonyms only in very specific contexts), or they use too fine-grained sense distinctions, such as in WordNet, which often distinguish too many and too close verb senses (Palmer et al., 2007); second, a coverage problem—simply there are not enough verbs covered or some verb senses are missing.

In our project, we attempt to introduce criteria, based mainly on valency or predicate-argument structure (taking into account both semantic and morphosyntactic properties of verbs) to help define both the granularity of verb senses as well as the synonym classes themselves. Along with Levin, 2013, we refer to predicate-argument structure as to those structures that involve the realization of lexical item’s arguments, including morphosyntactic properties that affect the morphosyntactic realization of arguments. This is similar to our valency approach, the FGD Valency Theory (FGDVT), first described in Panevová, 1974. As Levin, 2013 notes, the meaning of a verb may be characterized via the relations that its arguments bear to it and “Semantic Roles” (SRs) can be seen as labels for certain recurring predicate-argument relations.

In addition, we have chosen to use multilingual, rather than monolingual-only evidence to help with both the sense distinctions and the synonymy relation proper. We have started with Czech and English, since there are resources (both lexical and textual) that allow us to do so.

The goal of the project is thus to group verbs used as synonyms in Czech and English into (cross-lingual) synonym classes representing a cross-lingual meaning of the state or event expressed by the set of verbs assigned to that class. We call the resulting lexicon CzEngClass.

For the purpose of this work, we use the term “synonym” in the “loose” interpretation (Lyons, 1968), i.e., the necessary semantic equivalence takes also wider context into account. We proceed strictly “bottom-up”, i.e. from the corpus and existing lexical resources towards the new lexicon. The novel feature is the use of a richly annotated bilingual corpus (Sect. 2) to achieve deeper insight into the usage of verbs (together with their arguments) in translation.

The results reported in our paper are based on a sample of 60 classes manually processed and entered into the CzEngClass lexicon. We also describe their linkage to additional existing resources, the relevant features of which are described, too (Sect. 3). The tool used for creating this sample is described elsewhere in this volume (Urešová et al., 2018). Our approach to synonymy, meaning and sense is captured in Section 4. Section 5 deals with the design of CzEngClass lexicon. In Section 6, we exemplify the main (albeit first) findings. We comment on the CzEngClass’ criteria for grouping synonymous, based on samples that have been annotated and processed while creating the first entries. Section 7 summarizes our approach and points to future work.

2. Corpus Resources

For our work we use primarily the parallel Wall Street Journal (WSJ) part of the Penn Treebank (Marcus et al., 1993) and its manual (human) Czech translations. Each language part is enhanced with a rich manual linguistic an-
notation in The Prague Dependency Treebank (PDT 2.0) style (Hajič et al., 2006; Hajič et al., 2018), which is in turn based on the Functional Generative Dependency (FGD) framework (Sgall et al., 1986). The PDT annotation uses a “stratification” (layered) approach containing multiple layers (morphology, surface syntax and deep syntax). The main annotated phenomena are (surface) dependency structure and (deep) syntactico-semantic labeling of predicate-argument structure. For the purpose of our study, it is important that the annotation contains interlinked surface dependency trees and deep syntactico-semantic (tectogrammatical) trees, both vertically and also horizontally across the two languages on sentence and node levels. At the deep layer, each verb node (occurrence) is additionally linked to the corresponding valency frame in the associated valency lexicons, PDT-Vallex and EngVallex (Sect. 5), effectively providing also word sense labeling for all verb occurrences in the bilingual corpus.

3. Lexical Resources

PDT-Vallex (Urešová et al., 2014). (Urešová, 2011) is a Czech valency lexicon, manually created in a bottom-up way during the annotation of the PDT/PCEDT 2.0. Each entry in the lexicon contains a headword (lemma) with associated valency frames. A valency frame typically corresponds to one sense of the verb, even though for close verb sense and identical valency frames only one valency frame may exist in the lexicon. Each valency frame includes labeled valency frame members, or valency “slots” (i.e., ACT for Actor, PAT for Patient, ADDR for Addressee, etc.), semantic “obligatoriness” attribute, and subcategorization information, i.e., required surface form(s) of the individual valency frame members. Most valency frames include a note or an example explaining their meaning and usage. The version of PDT-Vallex used here contains 11,933 valency frames for 7,121 verbs.

EngVallex (Cinková et al., 2014). (Cinková, 2006) is a valency lexicon of English verbs created on the same principles as PDT-Vallex by an automatic conversion from PropBank frame files (Palmer et al., 2005) which was manually refined afterwards. EngVallex was used for the annotation of the English part of the PCEDT 2.0. Currently, it contains 7,148 valency frames for 4,337 verbs. For the most part, EngVallex does not contain explicitly formalized subcategorization information.

Czech-English Vallex (Cinková et al., 2015). (Cinková et al., 2016) is based on the treebank annotation of the PCEDT 2.0 corpus, covering about 86,000 aligned verbal pairs. It is a manually annotated Czech-English valency lexicon linking verbal entries of PDT-Vallex and EngVallex. Over 66% of English verbs and 72% of Czech verbs in the PCEDT 2.0 have a verbal translation covered by the CzEngVallex mapping. CzEngVallex builds links not only between corresponding verbal frames but also between corresponding verb arguments for each pair of verb senses, providing an interlinked database of argument structures available for each verb and documenting a cross-lingual comparison of Czech and English valency behavior.

VALLEX (Lopatková et al., 2016) is closely related to PDT-Vallex because it is built on the same theoretical framework. This lexicon is much more elaborated, however it is not based on the PDT data.

Among other resources we use, there are FrameNet (Baker et al., 1998; Fillmore et al., 2003), FrameNet+ (Pavlick et al., 2015), VerbNet (Schuler, 2006), SemLink (Palmer, 2009; Bonial et al., 2012), PropBank (Palmer et al., 2005) and English WordNet (Miller, 1995; Fellbaum, 1998) as well as Czech WordNet (Pala et al., 2011), (Pala and Smrž, 2004). These resources have been used for an initial set of semantic roles (taken mostly from FrameNet and VerbNet) and their entries will be referred to explicitly from all the corresponding entries in the CzEngClass lexicon, if possible to the exact lexical units/frames/sense groups/synsets.

4. Synonymy

Before we address synonymy, we make a short digression to the term “meaning” and term “sense” as we interpret them in our work, due to sometimes wildly different understandings of these terms.

We understand the term “sense” in the same way as e.g., (Hofmann, 1993) saying “when a form has several different concepts associated with it, we sometimes call them different senses or readings of the word.” (Wierzbicka, 1996) has the same approach, explaining the term “sense” on four different senses of the word spring. We also differentiate a single verb (type, lemma, possibly multiform) into one or more “senses,” represented by its valency frame; in our lexical valency resources (PDT-Vallex and EngVallex) the individual senses (i.e., the valency frames) of a verb are technically represented by a unique ID. The term (lexical) “meaning” is understood here with regard to a context, i.e., syntactic and semantic surroundings of the word; similarly to Wittgenstein’s understanding that “the meaning of an expression is a function of its use in a particular context” (Frawley, 1992). In our use of the terms “meaning” and “sense”, the following holds:

* “sense” is used only to distinguish different meanings within one verb type (lemma), e.g., the verb leave has (at least) two senses, leave sth somewhere (leave book on the table) and leave someplace [for some other place] (leave Paris [for London]),

* “meaning” is not applied to verbs (lemmas, verb types), but only to their distinguished senses (lexical units), and can be compared across such units: e.g., leave in the sense leave someplace [for some other place] has similar meaning to depart in its sense depart from somewhere,

* consequently, two senses of the same verb can never be totally equivalent, i.e., they never have the same

3For explanation of the term “sense”, as it is used in this paper, please see Sec 4

4EngVallex preserves most of the links to PropBank.

5The remaining pairings are verb-noun or verbs translated as structurally different constructions.

6http://ufal.mff.cuni.cz/vallex/3.0/

7https://wordnet.princeton.edu/

8The current theories of SRs are reviewed in more detail in Levin and Hovav, 2009.
meaning (they would not be separated if they were equivalent),

- meanings can thus only be (non-trivially) compared across verbs (more precisely, across lexical units defined for (“within”) different verbs).

In the working definition for establishing the CzEngClass entries, we use “contextually-based” synonymy. For two verbs (verb senses) to be considered contextually synonymous, and therefore be members of the same class, they have to convey the same or similar meaning, both monolingually and cross-lingually, and they must share the same Semantic Roles (SRs), albeit they can be expressed by different morphosyntactic realizations as well as subject to additional restrictions.

5. Structure of CzEngClass Lexicon

For our study, the following lexicon structure (Fig. 1) has been designed.

The CzEngClass lexicon builds upon the existing resources, as described above: CzEngVallex, PDT-Vallex and EngVallex and the PCEDT parallel corpus. In addition, the other lexicons listed (VALLEX, FrameNet, VerbNet, PropBank and WordNet(s)) are used as additional sources, and links will be kept between their entries and the CzEngClass entries.

At the core of the CzEngClass lexicon, there are Synonym Classes, which are, for the purpose of this project, defined as (multilingual, or rather cross-lingual)9 groups of verb senses (of different words) that have the same meaning and the arguments of which can be mapped to a common set of SRs (cf. the purple boxes Agent, Item, Change in Fig. 1). SRs have been reviewed (with FrameNet’s core roles for the linked-to entry(ies) providing inspiration) and determined for all the members of the group, and mapped to arguments from EngVallex (and PDT-Vallex for Czech verbs), using also the pairings from the CzEngVallex lexicon, which is in turn linked to the PCEDT parallel Czech-English corpus (lower part of Fig. 1).

6. CzEngClass Examples

We capture the common background information of one synonym class realized through a set of common SRs in one “frame,” called SynSemFrame (synonym semantic frame). We present two examples here.

In the relatively straightforward synonym verb class in Table 1 exemplified in the three sentences below, we consider all verbs to be synonyms and group them in the SynSemFrame COMPLAIN, since the valency pattern of the source verbs complain, gripe, grumble correlates (for almost all arguments) 1:1 with the valency pattern of the translational equivalent, i.e., verb stěžovat si (lit. complain). The exception is the Czech verb itself, where both ADDR and LOC can be mapped to the role Addresssee. The reason is, however, simply the conventions applied in the FGDVT to cases where the surface expression is location rather than (= in place of) (a) true addressee (as an animate agent); typically, this happens for offices (to the clerk ADDR vs. at the court office LOC), government seats (to the governor ADDR vs. in Annapolis LOC), etc. Consequently, in all these cases, functors from the valency lexicons and the deep dependencies can easily be mapped to a common set of SRs, taken from FrameNet in this case.

Examples (Czech translations double as examples for the Czech verb stěžovat si in the class):

En: Mrs. Yeargin. Complains/ADD to never complained to school officials/ADDR (that the standardized test was unfair)/COMPLAINT/PAT. Cz: Yearginová. Complains/ADD si nikdy na školském úřední/ACT stěžovala na nespravedlnost/COMPLAINT/PAT standardized_/VALLEX_/ADDR.

En: “[For $10 million, you can move $100 million of stocks,].” Complaint/ADD a specialist/COMPLAINT/PAT gripes. NULL. Addresssee/ADDR. Cz: [“Za 10 milionu dolaru můžete přesunout akcie za 100 milionu dolaru,” ]/COMPLAINT/PAT stěžuje si ... odborník. Complains/ADD NULL/ADDR.

En: Soviet consumers. Complains/ADD grumble at the exorbitant black-market prices. Complaint/ADD NULL/ADDR. Cz: Sovětí spotřebitelé/ADD stěžují na nehorizontální ceny. Complaint/ADD za takové zboží na černém trhu. NULL. Addresssee/ADDR.

Table 1: Mappings for COMPLAINT class

|       | Complain | Addresssee | Complaint |
|-------|----------|------------|-----------|
| stěžovat si | ACT | ADDR, LOC | PAT |
| complain | ACT | ADDR | PAT |
| gripe | ACT | ADDR | PAT |
| grumble | ACT | ADDR | PAT |

Table 2 shows the class OFFER, with additional complex examples. While the verbs offer, bid, proffer and tender, as well as the Czech verb nabídnout do not pose any problem in mapping their valency arguments to the four SRs associated with this class, the other aligned translations, described below, are more complex.

The verb extend (in the sense “extend an offer”) seems not to fit the pattern; without the Entity Offered/PAT being a noun phrase meaning exactly what the class is about, namely offers, bids, aid, etc., its meaning is more similar to “hand over” than to “offer”. However, looking up all the possible deep objects to this meaning of extend, it is clear that it cannot be complemented by a direct object not being an offer, bid or something similar. If such a noun is further modified, one of its dependents might describe the Entity Offered (e.g., employment: employment offer or offer of employment). If it is not present, this construction simply says that there was an offer while not specifying anything more specific about it, unless the word offer or its equivalent is left out and the Entity Offered is specified as a dependent directly on the verb extend itself, as in the banks ... extended [company] up to $90 million in revolving loans. Therefore, both the PAT as well as the restrictive attribute of the PAT (denoted as PAT(RSTR)) can be the Entity Offered.

The verbal phrase make available is also used as a translation of the Czech verb nabídnout. In this case, make behaves almost as a light verb, which typically keeps some

9For the time being, bilingual: in Czech and English.
arguments (mostly ACT) and “pushes” some other ones to the nominal part. In this case, the situation is similar, without make being considered a light verb (otherwise, a different functor would have been used for available). From the example below, it is clear that the translation was quite adequate and thus make available should be kept in the synonym class OFFER (see the deep dependency annotation of this example captured in Figure [2], where the Recipient is annotated with the relation BEN as a dependent on available, denoted as EFF(BEN) in Table [2]).

En: Japanese researchers, offerer/ACT ... have made available, EFF three possible cures, entity offered/PAT to American researchers, recipient/BEN ...
Cz: Japonští výzkumníci nabídli ... americkým výzkumníkům tři možné léčebné postupy ...

Last translation used for nabídnout was place (a value), e.g., in the sentence:

En: ... buyers who place the highest value on them.
Cz: ... kupujícím, kteří za ně nabídnou nejvyšší hodnotu.

However, this is considered pure nominalization (other sentences have been found where offer, bid, etc. as a head of a noun phrase is aligned with a Czech content verb), even if there was no other equivalent word for place in the Czech translation. This is an example where the translated text probably does not have the same effect on the target reader: the translator simply added content to a sentence based on her/his understanding of the context. Therefore, the verb place was, at present, not included in the OFFER synonym class. This also demonstrates the difference between interlingual synonymy (which defines the CzEngClass lexicon) and translational equivalence (not necessarily represented).
En: Japanese researchers... have made available three possible cures to American researchers.

Cz: Japonští výzkumníci nabídli ... americkým výzkumníkům tři možné léčebné postupy.

Figure 2: Dependency tree annotations for English sentence rooted in make available and its Czech translation.

7. Conclusions and Future Work

The CzEngClass lexicon is a contribution to a set of lexical resources important for many NLP tasks, such as event detection and linking, semantic relation extraction, etc. While these tasks often use unlabeled data for training, there is always a need for human-annotated data for evaluation, tuning, etc. Importantly, we believe that such a resource is currently missing in the offerings of lexical resources. In addition, it contains links to all the relevant related resources, such as VALLEX, FrameNet, VerbNet, PropBank and WordNet, making it suitable for comparative studies.

We have based our study on the assumption that mapping syntactic structure (verb arguments) to semantic roles (with some added restrictions) helps us discover their meaning affinity through which we can group these verbs into synonym classes. To help avoid single-language bias, we have used a parallel corpus and the alignments of verbs, previously manually checked and extracted. In such a corpus, aligned translations of a single verb should in principle be, in most cases, synonymous. The resulting sets of cross-lingual synonyms including the explicit mappings between the FGDVT valency functors and the semantic roles assigned to each synonym set are captured in the CzEngClass lexicon. So far, the roles used in FrameNet and VerbNet seem to form a suitable set for each synonym class and the mapping. However some adjustments, e.g., merging the roles, adding non-core roles, have to be made.

Once the lexicon reaches reasonable size (approx. 500 classes), we will compare the results with automated synonym discovery methods, such as (van der Plas et al., 2011; van der Plas et al., 2014), either using Deep Learning (looking, e.g., at embeddings based on argument-role mapping) or other previously well-researched methods, such as the LDA which has been already used for Czech, e.g., in (Materna, 2012).

Finally, we plan to publish the resulting CzEngClass lexicon as an open source dataset.

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