Grouping axioms for more coherent ontology descriptions

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Grouping Axioms for More Coherent Ontology Descriptions

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Abstract
Ontologies and datasets for the Semantic Web are encoded in OWL formalisms that are not easily comprehended by people. To make ontologies accessible to human domain experts, several research groups have developed ontology verbalisers using Natural Language Generation. In practice ontologies are usually composed of simple axioms, so that realising them separately is relatively easy; there remains however the problem of producing texts that are coherent and efficient. We describe in this paper some methods for producing sentences that aggregate over sets of axioms that share the same logical structure. Because these methods are based on logical structure rather than domain-specific concepts or language-specific syntax, they are generic both as regards domain and language.

1 Introduction
When the Semantic Web becomes established, people will want to build their own knowledge bases (i.e., ontologies, or TBox axioms, and data, or ABox axioms). Building these requires a high level of expertise and is time-consuming, even with the help of graphical interface tools such as Protégé (Knublauch et al., 2004). Fortunately, natural language engineers have provided a solution to at least part of the problem: verbalisers, e.g., the OWL ACE verbaliser (Kaljurand and Fuchs, 2007).

Ontology verbalisers are NLG systems that generate controlled natural language from Semantic Web languages, see Smart (2008). Typically they generate one sentence per axiom: for example, from the axiom\(^2\) \(\text{Cat} \sqsubseteq \text{Animal}\) the OWL ACE verbaliser (Kaljurand and Fuchs, 2007) generates ‘Every cat is an animal’. The result is not a coherent text, however, but a disorganised list, often including inefficient repetitions such as:

- Every cat is an animal.
- Every dog is an animal.
- Every horse is an animal.
- Every rabbit is an animal.

An obvious first step towards improved efficiency and coherence would be to replace such lists with a single aggregated sentence:

The following are kinds of animals: cats, dogs, horses and rabbits.

In this paper, we show how all axiom patterns in \(\mathcal{EL}++\), a DL commonly used in the Semantic Web, can be aggregated without further domain knowledge, and describe a prototype system that performs such aggregations. Our method aggregates axioms while they are still in logical form, i.e., as part of sentence planning but before converting to a linguistic representation and realising as English sentences. This approach is somewhat different from that proposed by other researchers who convert ontology axioms to linguistic structures before aggregating (Hielkema, 2009; Galanis et al., 2009; Dongilli, 2008). We present results from testing our algorithm on over fifty ontologies from the Tones repository\(^3\).

2 Analysis of Axiom Groupings
In this section we analyse which kinds of axioms might be grouped together. Power (2010) anal-

\(^2\)For brevity we use logic notation rather than e.g., OWL Functional Syntax: \(\text{subClassOf}([\text{class}(\text{ns:cat})\text{class}(\text{ns:animal})])\) where \text{ns} is any valid namespace. The operator \(\sqsubseteq\) denotes the subclass relation, \(\sqcap\) denotes class intersection, and \(\exists P.C\) the class of individuals bearing the relation \(P\) to one or more members of class \(C\).

\(^3\)http://owl.cs.manchester.ac.uk/
Table 1: The four most common axiom patterns.

<table>
<thead>
<tr>
<th>No.</th>
<th>Logic</th>
<th>OWL</th>
<th>%</th>
</tr>
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<tbody>
<tr>
<td>1</td>
<td>$A \sqsubseteq B$</td>
<td>subClassOf(A B)</td>
<td>51</td>
</tr>
<tr>
<td>2</td>
<td>$A \sqsubseteq \exists P.B$</td>
<td>subClassOf(A someValuesFrom(P B))</td>
<td>33</td>
</tr>
<tr>
<td>3</td>
<td>$[a, b] \in P$</td>
<td>propertyAssertion(P a b)</td>
<td>8</td>
</tr>
<tr>
<td>4</td>
<td>$a \in A$</td>
<td>classAssertion(A a)</td>
<td>4</td>
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Table 2 summarises our conclusions on whether each pair of the four common patterns can be merged or chained. Each cell contains three entries, indicating the possibility of left-hand-side merge (L), right-hand-side merge (R), and chaining (C). As can be seen, some merges or chains are possible across different patterns, but the safest aggregations are those grouping axioms with the same pattern (down the diagonal), and it is these on which we focus here.

### 3 Merging Similar Patterns

#### Table 3: Generic merging rules.

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<tr>
<th>Function</th>
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<tr>
<td>$f_1(A)$</td>
<td>$f_1((A_1, A_2, A_3, \ldots))$</td>
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derived from identifiers and labels within the input ontology.

Input to the application is an OWL/XML file. Axioms that conform to $\mathcal{EL}^{++}$ DL are selected and converted into Prolog format. A draft lexicon is then built automatically from the identifier names and labels, on the assumption that classes are lexicalised by noun groups, properties by verb groups with valency two, and individuals by proper nouns.

Our aggregation rules are applied to axioms with the same logical form. The first step picks out all the logical patterns present in the input ontology by abstracting from atomic terms. The next step searches for all axioms matching each of the patterns present. Then within each pattern-set, the algorithm searches for axioms that differ by only one argument, grouping axioms together in the ways suggested in table 3. It exhaustively lists every possible grouping and builds a new, aggregated axiom placing the values for the merged argument in a list, e.g., consider the axioms:

\[
\begin{align*}
&\text{subClassOf}(\text{class(cat)}, \text{class(feline)}). \\
&\text{subClassOf}(\text{class(cat)}, \text{class(mammal)}). \\
&\text{subClassOf}(\text{class(dog)}, \text{class(mammal)}). \\
&\text{subClassOf}(\text{class(mouse)}, \text{class(mammal)}). \\
\end{align*}
\]

Identical first arguments $\implies$
\[
\begin{align*}
&\text{subClassOf}(\text{class(cat)}, \\
&\quad [\text{class(feline)}, \\
&\quad \quad \text{class(mammal)}]). \\
\end{align*}
\]

`Every cat is a feline and a mammal.'

Identical second arguments $\implies$
\[
\begin{align*}
&\text{subClassOf}(\text{[class(cat), class(dog),} \\
&\quad \quad \text{class(mammal)]}). \\
\end{align*}
\]

`The following are kinds of mammal: cats, dogs and mice.'

For all axioms with an identical first argument, class(cat), the algorithm places the second arguments in a list, [class(feline), class(mammal)], and builds a new axiom with the first argument and the merged second argument. From this, our realiser generates the sentence ‘Every cat is a feline and a mammal.’ A similar process is performed on first arguments when the second arguments are identical.

To construct the grammar, we first formulated rules for realising single axioms, and then added rules for the aggregated patterns, incorporating aggregation cues such as ‘both’ and ‘the following’: (Dalianis and Hovy, 1996). For the wording of single axioms we relied mainly on proposals from the OWL Controlled Natural Language task force (Schwitter et al., 2008), so obtaining reasonably natural sentences for common axiom patterns, even though some less common axioms such as those describing attributes of properties (e.g., domain, range, functionality, reflexivity, transitivity) are hard to express without falling back on technical concepts from the logic of relations; for these we have (for now) allowed short technical formulations (e.g., ‘The property “has as part” is transitive’). With these limitations, the grammar currently realises any single axiom conforming to $\mathcal{EL}^{++}$, or any aggregation of $\mathcal{EL}^{++}$ axioms through the merge rules described above. Table 4 lists example aggregated axiom patterns and English realisations generated with our grammar.

## 5 Testing the ‘Merging’ Algorithm

<table>
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<th>Unit</th>
<th>Original</th>
<th>Aggregated</th>
<th>Reduction</th>
</tr>
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<tbody>
<tr>
<td>Sentences</td>
<td>35,542</td>
<td>11,948</td>
<td>66%</td>
</tr>
<tr>
<td>Words</td>
<td>320,603</td>
<td>264,461</td>
<td>18%</td>
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</table>

Table 5: Reduction achieved by aggregating

We have tested our generic merging rules on axioms conforming to $\mathcal{EL}^{++}$ in a sample of around 50 ontologies. Table 5 shows the reduction in the number of generated sentence after aggregation. Remember that previously, the system generated one sentence for every axiom (35,542 sentences), but with aggregation this is reduced to 11,948 sentences, an overall reduction of 66%. However, aggregation increases sentence length so the saving in words is only 18%.

The effect of merging is to replace a large number of short sentences with a smaller number of longer ones. Sometimes the aggregated sentences were very long indeed, e.g., when a travel ontology cited 800 instances of the class island — perhaps such cases would be expressed better by a table than by prose.

The algorithm computes all possible merges, so we get, for instance, Fred described as a person in both ‘The following are people: Fred, . . . ’ and ‘Fred is all of the following: a person, . . . ’. This means that the greater efficiency achieved through aggregation may be counterbalanced by the extra text required when the same axiom participates in several merges — for a few of our ontologies, in

\[\text{Table 5: Reduction achieved by aggregating}\]

\[\begin{align*}
\text{Unit} & \quad \text{Original} & \quad \text{Aggregated} & \quad \text{Reduction} \\
\text{Sentences} & 35,542 & 11,948 & 66\% \\
\text{Words} & 320,603 & 264,461 & 18\% \\
\end{align*}\]

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\text{For all axioms with an identical first argument, class(cat), the algorithm places the second arguments in a list, [class(feline), class(mammal)], and builds a new axiom with the first argument and the merged second argument. From this, our realiser generates the sentence ‘Every cat is a feline and a mammal.’ A similar process is performed on first arguments when the second arguments are identical.}
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\[\begin{align*}
\text{5 We convert OWL to OWL/XML with the Manchester OWL Syntax Converter http://owl.cs.manchester.ac.uk/converter/}
\end{align*}\]

\[\begin{align*}
\text{6 In a summary one might instead simply give a count and an example: ‘There are 800 islands, e.g., The Isle of Skye’ .}
\end{align*}\]
It is not true that Walt has as pet Fluffy or Rex.

The following are kinds of vehicles: a bicycle, a car, a truck and a van.

The following are kinds of something that has as topping a tomato: a fungi, a fiorella and a margherita.

Every fiorella is something that has as topping a mozzarella and is the Three Star Rating or the Two Star Rating.

If any of the following relationships hold between X and Y then Y must be a contact: “has as city”, “has as street” and “has as zip code”.

None of the following are mad cows: an adult, a kid, a lorry or a lorry driver.

The approach most similar to ours is that of Bontcheva and Wilks (2004), who aggregated a subset of RDF triples after domain-dependent discourse structuring — a task equivalent to merging axioms that conform to the objectPropertyAssertion pattern in table 4.

7 Conclusion

We have demonstrated that for the $\mathcal{EL}++$ DL that underlies many Semantic Web ontologies we can define generic aggregation rules based on logical structure, each linked to a syntactic rule for expressing the aggregated axioms in English. The work described here is a first step in tackling a potentially complex area, and relies at present on several intuitive assumptions that need to be confirmed empirically. First, from an examination of all combinations of the four commonest axiom patterns, we concluded that axioms sharing the same pattern could be combined more effectively than axioms with different patterns, and therefore focussed first on same-pattern merges with variations in only one constituent. Secondly, after systematically enumerating all such merges for $\mathcal{EL}++$, we have implemented a grammar that expresses each aggregated pattern in English, relying on an intuitive choice of the best form of words: at a later stage we need to confirm that the resulting sentences are clearly understood, and to consider whether different formulations might be better.

Acknowledgments

This work is supported by the UK Engineering and Physical Sciences Research Council (EPSRC) grant EP/G033579/1 (SWAT: Semantic Web Authoring Tool). We thank our colleagues and the anonymous reviewers.

<table>
<thead>
<tr>
<th>Aggregated Axiom Pattern</th>
<th>Example of Generated Text</th>
</tr>
</thead>
<tbody>
<tr>
<td>subClassOf($C_1$, $C_2$, $\ldots$, $C_n$)</td>
<td>The following are kinds of vehicles: a bicycle, a car, a truck and a van.</td>
</tr>
<tr>
<td>subClassOf($C_1$, $C_2$, $\ldots$, $C_n$)</td>
<td>Every old lady is all of the following: a cat owner, an elderly and a woman.</td>
</tr>
<tr>
<td>objectPropertyAssertion($P_1$, $C_1$, $C_2$)</td>
<td>The following are pets of Walt: Dewey, Huey and Louie.</td>
</tr>
<tr>
<td>objectPropertyAssertion($P_1$, $C_1$, $C_2$)</td>
<td>Walt has as pet Dewey, Huey and Louie.</td>
</tr>
<tr>
<td>disjointClasses($C_1$, $C_2$, $\ldots$, $C_n$)</td>
<td>None of the following are mad cows: an adult, a lorry or a lorry driver.</td>
</tr>
</tbody>
</table>

Table 4: Example realisations of common aggregated $\mathcal{EL}++$ axiom patterns.
References


