# The Effects of Multi-Word Tagging on Text Disambiguation 

Miloš Utvić ${ }^{1}$, Ivan Obradović ${ }^{2}$, Cvetana Krstev ${ }^{1}$, Duško Vitas ${ }^{3}$, ${ }^{1}$ University of Belgrade, Faculty of Philology<br>${ }^{2}$ University of Belgrade, Faculty of Mining and Geology<br>${ }^{3}$ University of Belgrade, Faculty of Mathematics<br>E-mail: misko@matf.bg.ac.rs, ivano@rgf.bg.ac.rs, cvetana@matf.bg.ac.rs, vitas@matf.bg.ac.rs


#### Abstract

This paper outlines an experiment aimed at assessing the effects that tagging of multi-words in a text has on text disambiguation. The experiment was performed on the Serbian translation of Verne's novel 'Around the world in 80 days', and consisted of two steps: in the first step we applied only resources for single words, while in the second step we included available resources for multi-word tagging. We have assessed the effects of using the multi-word resources through several measures pertaining to overall ambiguity, ambiguity of lemmas and ambiguity of grammatical categories. The results confirmed that the tagging with multi-word units reduces the ambiguity of a text, which was to be expected, but also showed that despite considerable benefit obtained in specific cases the overall reduction of ambiguity was not substantial, at least for the given example and the available resources. We further analyze the possible reasons for such results and ways of to improve them.


Keywords: text disambiguation, text tagging, multi-word units, morphological electronic dictionaries, Unitex.

## 1 Motivation

The ambiguity, or rather false ambiguity, of a text processed by morphological electronic dictionary is high for Serbian, as for many other languages. Unfortunately, with the enlargement of e-dictionaries the rate of ambiguity rises as well. The automatic elimination of false ambiguities without eliminating the correct grammatical solutions is a difficult task in Natural Language Processing. It seems that correct recognition and tagging of multi-word units could help in this direction. Some authors have observed that usage of multi-word units helps in various natural language processing tasks. Villavicencio in (Villavicencio et al., 2007) states that usage of multi-word units increases the grammar coverage in syntactic processing while Alegria in (Alegria et al., 2004) obtained a significantly higher precision of POS tagging when using multiword units.

This point can best be illustrated by the following example. If we analyze the title of Verne's novel Put oko sveta za 80 dana 'Around the world in 80 days' taking into consideration simple words only, we obtain the results shown in Table 1.

Table 1. Potential grammatical tags of the phrase Put oko sveta za 80 dana when considering only simple word units.

| Put | oko | Sveta | Za | 8 | 0 | dana |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| put,.ADV | oko,.N:ns1q | sveta,svet.A:aefs1g | za,.PREP+p2 |  |  | dana, dan.A+PP:aefs1g |
| put, .N:fs1q | oko,.N:ns4q | sveta, Svet.A:aefs5g | za,.PREP+p4 |  |  | dana,dan.A+PP:aefs5g |
| put,.N:fs4q | oko,.N:ns5q | sveta,svet.A:aemw2g | za,.PREP+p6 |  |  | dana,dan.A+PP:aemw2g |
| put,.N:ms1q | oko,.PREP+p2 | sveta,svet.A:aemw4g |  |  |  | dana,dan.A+PP:aemw4g |
| put,.N:ms4q | oko,oka.N:fs5q | sveta,svet.A:aenw2g |  |  |  | dana,dan.A+PP:aenw2g |
| put,.PREP+p2 |  | sveta,svet.A:aenw4g |  |  |  | dana,dan.A+PP:aenw4g |
|  |  | sveta,svet.A:aenp1g |  |  |  | dana,dan.A+PP:aenw4g |
|  |  | sveta,svet.A:aenp4g |  |  |  | dana,dan.A+PP:aenp1g |
|  |  | sveta,svet.A:aenp5g |  |  |  | dana,dan.A+PP:aenp4g |
|  |  | sveta,svet.A:akms2g |  |  |  | dana,dan.A+PP:aenp5g |
|  |  | sveta,svet.A:akms4v |  |  |  | dana,dan.A+PP:akms2g |
|  |  | sveta,svet.A:Akns2g |  |  |  | dana,dan.A+PP:akms4v |
|  |  | sveta,svet.N+Ek:mw2q |  |  |  | dana,dan.A+PP:akns2g |
|  |  | sveta,svet.N+Ek:mw4q |  |  |  | dana,dan.N:mw2q |
|  |  | sveta,svet.N+Ek:ms2q |  |  |  | dana,dan.N:mw4q |
|  |  |  |  |  |  | dana,dan.N:mp2q |
|  |  |  |  |  |  | dana,dan.N:ms2q |
|  |  |  |  |  |  | dana,dati. $\mathrm{V}+\mathrm{Perf+Tr+Iref+Ref:Tfs}$ |
|  |  |  |  |  |  | dana, dati.V+Perf+Tr+\|ref+Ref:Tmw |
|  |  |  |  |  |  | dana, dati.V+Perf+Tr+Iref+Ref:Tnw |
|  |  |  |  |  |  | dana,dati.V+Perf+Tr+Iref+Ref:Tnp |
| 6 grammatical solutions/ 4 lemmas | 5 grammatical solutions/3 lemmas | 15 grammatical solutions/2 lemmas | 3 lemmas | 1 | 1 | 21 grammatical solutions/3 lemmas |

If we analyze the same title with multi-word units as well, this analysis yields the results presented in Table 2.

Table 2. Potential grammatical tags of the phrase Put oko sveta za 80 dana when considering only multi-word units.

| Put oko sveta | za | $\mathbf{8 0}$ | dana |
| :--- | :--- | :--- | :--- |
| put oko sveta,.N+Comp:s1qm | za,.PREP+p2 | $80, \mathrm{NUM}+\mathrm{C}+\mathrm{v5} 5$ | dana,dan.A+PP:aefs1g |
| put oko sveta,.N+Comp:s4qm | za,.PREP+p4 |  | dana,dan.A+PP:aefs5g |
|  | za,.PREP+p6 |  | dana,dan.A+PP:aemw2g |
|  | 3 lemmas | 1 lemma | 21 grammatical solutions/3 <br> lemmas |
| 2 grammatical solution/1 <br> lemma |  |  |  |

This example shows that when only simple words were used the analysis tokenized the title into 7 tokens. The average number of lemmas per token was $17 / 7=2.43$, while the average number of grammatical solutions per token was $52 / 7=7.43$. The number of possible paths in the sentence graph was 28,350 . The analysis that included dictionaries of compounds and dictionary graphs for multi-token and multi-word numerals tokenized the title into 4 tokens. The average number of
lemmas per token was $8 / 4=2$, while the average number of grammatical solutions per token was $27 / 4=6.75$. The number of possible paths in the sentence graph was 126 .

When judging these results one has to bear in mind that although the average numbers in the latter case were not dramatically lower, they were computed on almost a half of the number of tokens -4 vs . 7 . On the other hand, the number of paths in the sentence graph was reduced considerably.

We could quite easily eliminate some other false ambiguities with the use of, for instance, ELAG grammars (Laporte 1999). One such grammar would distinguish from the set of 21 offered grammatical solutions for dana the correct one dana,dan.N:mp2q, since it follows the numeral 80 that agrees with nouns (and other part-of-speech) in the plural genitive case. However, in this experiment we will not consider the effects of such solutions to the disambiguation process.

## 2 The set-up of the experiment

For our experiment we have chosen the Serbian translation of Verne's novel Le tours du monde en quatre-vingt jours 'Around the world in 80 days'. We have decided to work with this text for two reasons. First of all, many compound words from this novel were previously identified and added to the Serbian dictionary of compounds. Namely, the work presented in (Laporte et al., 2008) served as the basis for detecting a number of compounds in Serbian and adding them in the Serbian dictionary of compounds (Vitas et al., 2008), - a total of 143 DELAC entries. Since Serbian dictionaries of compounds are still under-developed, using a novel with good compound coverage produced a more realistic environment for the experiment. Second, since Serbian version of the text is already part-of-speech and grammatically lemmatized with simple words, and partly with multi-word units as well (Tufiș et al., 2008), we plan to combine the results of this experiment with the lemmatized text for some future research.

The Serbian version of the novel processed by Unitex has 4,226 sentence delimiters, 279 digits and 58,724 simple forms, compared to the French original that has 4,458 sentences, 438 digits and 71,859 simple forms. Lexical resources for simple words used for processing the text consist of general dictionaries, dictionaries of proper names (personal and geographic names), a rudimentary dictionary of encyclopedic knowledge and a small dictionary specific to this text. This last dictionary consists mainly of proper names and derived adjectives specific to this text,
like Paspartu 'Passepartout'. However, this dictionary is not exhaustive so 276 simple words occurring 620 times remained unrecognized. Most of them are also proper names and derived adjectives. When the French original of the novel was processed by Unitex using French lexical resources 384 simple words remained unrecognized.

Lexical resources for multi-word units applied to the text were of various types. For recognition of numerals several dictionary transducers were applied. This way we recognized numerals written with digits only -60.000 , spelled numerals - tri hiljade devet stotina i devedeset $i$ devet 'three thousand nine hundred and ninety and nine', as well as some abbreviated ordinal numbers - 21-og ' $21^{\text {st }}$. In addition to that we used our dictionary of common compounds (nouns and adjectives), as well as proper compound names.

While the French original was associated with 2,044 compound lexical entries (vs. 13,031 simple lexical entries), the Serbian text was associated with 802 compound lexical entries (vs. 43,092 simple lexical entries). Among them were 131 numerals, 23 adjectives, 35 adverbs, 19 conjunctions, 35 prepositions, and 559 nouns ( 82 proper names). These compound lexical entries were associated to 1080 compound text tokens. The most frequent ( 49 times) compound token was the conjunction kao da 'as if' followed by several tokens related to the compound proper name Hong-Kong in three different cases with a total frequency of $68(27+22+19)$. The former could be considered as text independent but the latter is obviously strongly dependent on the subject of the analyzed text. For our analysis we assumed that all recognized multi-word units take precedence over simple word constituents. This does not mean that multi-word units are unambiguous since some of them (nouns and adjectives) can represent different grammatical realizations. All recognized multi-word units were manually checked, and our assumption was proven wrong in 13 cases - one noun, three adverbs and nine prepositions. One example is the sequence na to which can be a compound adverb 'upon that' as in Na to udovica ode iz grada... 'Alors la veuve quitta la ville, ...' ('(Upon that) the widow left the town...'), while in some cases it represents a preposition followed by a demonstrative pronoun 'to that', like in Na to je gospodin Fog odgovarao ... ‘A quoi Mr. Fogg répondait...' ('Mister Fogg responded to that...'). However, we believe that a small number of incorrect cases will not seriously affect our results.

## 3 Results of the experiment

### 3.1 Overall assessment of ambiguity

We divided our experiment in two parts: in the first part we applied to our text only resources for single words (we will refer to these results as 'swu') while in the second part we included in processing all available resources for tagging with multi-word units (these results will be referred as 'mwu'). In the second part of the experiment ('mwu'), the text was tokenized in 13,003 different tokens (types) with a total frequency of 71,986 ; among these tokens the tag $\{\mathrm{S}\}$ had the frequency 4,226 , while 12,546 different simple tokens (simple word forms and punctuation marks) had the frequency 66,680 (an average of 5.3 by token), while 456 different multi-word tokens had the frequency 1080 (an average of 2.4 by token).

In our experiment we were interested in word units rather than in all text tokens (such as punctuation marks). Table 3 shows that the number of word units in the text was reduced by $2.39 \%$ in the second experiment. The last two columns in the table show how many grammatical solutions and lemmas were on the average associated as potential tags to each word unit by applied lexical resources.

Table 3. Tokenization of text in simple word tokens vs. multiword tokens

|  | word <br> units | $\mathrm{gs} / \mathrm{wu}$ | lemma/wu |
| :--- | ---: | ---: | ---: |
| Swu | 59007 | 3.49 | 1.72 |
| Mwu | 57598 | 3.44 | 1.71 |
| Diff | 1409 |  |  |
| Diff \% | $2.39 \%$ |  |  |

Let us first look at the overall ambiguity of word types in terms of lemmas assigned to them in the 'swu' case. Out of 12,475 different types (after discarding all punctuation marks, digits and unknown words), in 4040 cases ( $32.3 \%$ ) a type was unambiguously a noun, in 2962 cases ( $23.7 \%$ ) it was an unambiguous verb, in 1976 cases ( $15.8 \%$ ) an unambiguous adjective, in 212 cases (1.7\%) an unambiguous pronoun, and in 173 cases ( $1.3 \%$ ) an unambiguous adverb. In all, about three quarter of text types an unambiguous lemma is assigned - although it does not mean that grammatical tags are unambiguous as well.

We will now look at the overall results obtained by applying multi-word lexical resources, summarized in Table 4 for different POS categories. The 'swu' columns give the number of possible grammatical solutions and candidate lemmas for each specific POS without the application of multi-word resources, and the 'mwu' columns give the numbers after the application. The difference is given in absolute numbers (diff) and percents (diff \%). The final
two columns give the ratio of possible grammatical solutions and candidate lemmas in the "swu" and 'mwu' case, respectively. With the application of multi word resources there is a reduction in all POS categories except for abbreviations, which is only natural. Besides unknown words (UNK) which have been reduced by $20 \%$, the best results were obtained for numerals (NUM) where both possible grammatical solutions and candidate lemmas were reduced by more than $13 \%$ and for adjectives (around $8 \%$ for both categories). It is interesting to note that there was no significant change in the ratio of possible grammatical solutions and candidate lemmas.

Table 4. Ambiguities in the text per different parts-of-speech

| PoS | Grammatical solutions |  |  |  | Lemmas |  |  |  | Gs/Lemmas |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
|  | swu | mwu | diff | diff\% | swu | mwu | diff | diff\% | swu | mwu |
| UNK | 620 | 496 | 124 | $20.00 \%$ | 620 | 496 | 124 | $20.00 \%$ | 1.00 | 1.00 |
| A | 41478 | 38125 | 3353 | $8.08 \%$ | 7641 | 7046 | 595 | $7.79 \%$ | $\mathbf{5 . 4 3}$ | $\mathbf{5 . 4 1}$ |
| ABB | 56 | 56 | 0 | $0.00 \%$ | 56 | 56 | 0 | $0.00 \%$ | 1.00 | 1.00 |
| ADV | 7431 | 7231 | 200 | $2.69 \%$ | 7431 | 7231 | 200 | $2.69 \%$ | 1.00 | 1.00 |
| CONJ | 6187 | 6024 | 163 | $2.63 \%$ | 6187 | 6024 | 163 | $2.63 \%$ | 1.00 | 1.00 |
| INT | 3167 | 3010 | 157 | $4.96 \%$ | 3167 | 3010 | 157 | $4.96 \%$ | 1.00 | 1.00 |
| N | 59834 | 58015 | 1819 | $3.04 \%$ | 24235 | 23672 | 563 | $2.32 \%$ | $\mathbf{2 . 4 7}$ | $\mathbf{2 . 4 5}$ |
| NUM | 4387 | 3808 | 579 | $13.20 \%$ | 1612 | 1391 | 221 | $13.71 \%$ | $\mathbf{2 . 7 2}$ | $\mathbf{2 . 7 4}$ |
| PAR | 7005 | 6817 | 188 | $2.68 \%$ | 7005 | 6817 | 188 | $2.68 \%$ | 1.00 | 1.00 |
| PREP | 11858 | 11345 | 513 | $4.33 \%$ | 11858 | 11345 | 513 | $4.33 \%$ | 1.00 | 1.00 |
| PRO | 28783 | 28620 | 163 | $0.57 \%$ | 11873 | 11793 | 80 | $0.67 \%$ | $\mathbf{2 . 4 2}$ | $\mathbf{2 . 4 3}$ |
| V | 34996 | 34549 | 447 | $1.28 \%$ | 19733 | 19528 | 205 | $1.04 \%$ | $\mathbf{1 . 7 7}$ | $\mathbf{1 . 7 7}$ |
| Total | 205802 | 198096 | 7706 | $3.75 \%$ | 101418 | 98409 | 3009 | $2.97 \%$ | $\mathbf{2 . 0 3}$ | $\mathbf{2 . 0 1}$ |

### 3.2 The ambiguity of lemmas

Further analysis showed that the most ambiguous type in terms of the assigned lemmas in both experiments - 'swu' and 'mwu' is the word form Po. It had a maximum of seven different lemmas assigned, however, only when appearing with the uppercase ' P '. Namely, both po and Po were assigned an adverb lemma (jedno po jedno 'one by one'), a particle lemma (devet i po 'nine and a half'), two preposition lemmas (a preposition with the instrumental case po lepom vremenu 'in nice weather' and a preposition with the accusative case po detektiva 'for detective'). However, to the uppercase Po three additional proper nouns were assigned: the English surname 'Poe' transcribed to Serbian, the Italian river Po, and the French town 'Pau', also transcribed to Serbian. All of the four former possibilities were realized in our text, but none of the proper nouns effectively appeared.

Six different lemmas were assigned to eight types in the 'swu' case and to seven types in the 'mwu' case, as shown in Table 5. It should be noted that all of them are case sensitive again;
namely, they had six lemmas assigned only when written in uppercase. The type mile which accounts for the reduction from eight types in the 'swu' case to seven in the 'mwu' case is particularly interesting for our research: it occurred only once in our text and as a component of the compound adverb do mile volje 'at their ease'. This adverb was recognized in the 'mwu' case and thus mile did not display its "high ambiguity" in this case. Unfortunately for our cause, the majority of other types with six assigned possible lemmas occurred more frequently (see Table 5), as did $P o$ (16) with its seven lemmas.

Table 5. Types with six assigned possible lemmas

| Type | Freq. | SWN | MWU |
| :--- | :--- | :--- | :--- |
| Bar | 1 | $5 \mathrm{~N}, 1$ PAR | $5 \mathrm{~N}, 1$ PAR |
| Bila | 6 | $4 \mathrm{~N}, 2 \mathrm{~V}$ | $4 \mathrm{~N}, 2 \mathrm{~V}$ |
| Dobro | 32 | $1 \mathrm{~A}, 1$ ADV, 4N | $1 \mathrm{~A}, 1$ ADV, 4N |
| Gore | 4 | $2 \mathrm{~A}, 1$ ADV, 1 N, 2 V | $2 \mathrm{~A}, 1$ ADV, 1 N, 2 V |
| Kose | 2 | $1 \mathrm{~A}, 4 \mathrm{~N}, 1 \mathrm{~V}$ | $1 \mathrm{~A}, 4 \mathrm{~N}, 1 \mathrm{~V}$ |
| Mile | 1 | $1 \mathrm{~A}, 5 \mathrm{~V}$ |  |
| Pola | 2 | $1 \mathrm{ADV}, 5 \mathrm{~N}$ | 1 ADV, 5 N |
| Više | 8 | $2 \mathrm{~A}, 1$ ADV, $1 \mathrm{~N}, 1$ PREP, 1 V | $2 \mathrm{~A}, 1$ ADV, $1 \mathrm{~N}, 1$ PREP, 1 V |

Five different lemmas were assigned to 26 types (both in the "swu" and the "mwu" case). It is interesting to note that više which appeared in the previous group with uppercase "V" appeared with lowercase " v " in this group as well, with the same possibilities except for the (proper) noun. By far the most frequent in this group was the type da (1 ADV, 1 CONJ, $1 \mathrm{INT}, 1$ PAR, 1 V ) - it occurred 1386 times. Four of these five possibilities were actually realized in our text:

SR: Nije prestajao da \{da, da. ConJ \} misli o tome.
FR: Cela ne laissait pas de le préoccuper.
$\mathrm{EN}^{1}$ : ... and these thoughts did not cease worrying him for a long time.
,,Da \{da, .da.INT\} !" odgovori Fileas Fog.
FR: Oui, répondit Phileas Fogg.
EN: "Yes," returned Phileas Fogg.
SR: Da \{da, da. PAR\} niste nešto zaboravili?
FR: Vous n'avez rien oublié?
EN: You have forgotten nothing?

[^0]SR: U podne vodič da \{da, dati.v\} znak za polazak.
FR: A midi, le guide donna le signal du départ.
EN : At noon the Parsee gave the signal of departure.
In the case of types with different lemmas assigned, the most frequent combination was a verb lemma and an adjective lemma - 615 cases, or $21 \%$ of the 2924 types with ambiguous lemmas. The cases that follow are: noun and verb ( $433 ; 14.8 \%$ ), noun and noun ( $332 ; 11.4 \%$ ), adjective and adverb (288; 9.8\%), and verb and verb (222; 7.6\%). All other combinations fall below $4 \%$ of types with ambiguous lemmas. The highest ambiguity between verbs and adjectives does not surprise: some verbal forms, like active and passive past participle and present and past gerund are often used as adjectives as well. In our texts some of these verbal forms, for some verbs, occurred in both functions: verbal or adjectival. Some examples are:

SR: Zaista, idući \{idući.ići.v:s\} na istok, Fileas Fog je išao prema suncu,... (present gerund of the verb ići 'to go')

FR: En effet, en marchant vers l'est, Phileas Fogg allait au-devant du soleil,...
EN: In other words, while Phileas Fogg, going eastward,...
SR: A kad će proći idući \{idući.idući. A: adms1g\} voz? upita Fileas Fog.
FR: Et le train suivant, quand passera-t-il? demanda Phileas Fogg.
EN: "And when does the next train pass here?" said Phileas Fogg.
SR: Da nije bilo bure, usled koje je izgubljeno \{izgubljeno, izgubiti.v: Gns\} nekoliko sati... (passive past participle of the verb izgubiti 'to lose')

FR: Sans cette tempête, pendant laquelle il perdit plusieurs heures,...
EN: Had there been no storm, during which several hours were lost,...
SR: Bilo je moguće nadoknaditi izgubljeno \{izgubljeno, izgubljen.A: aens1g\} vreme.
FR: Il n'était pas impossible que le retard fût regagné.
EN: It was not impossible that the lost time might yet be recovered;

### 3.3 The ambiguity of grammatical tags

The type with the greatest number of assigned grammatical tags was gore - a total of 32 grammatical tags: 20 A (for two adjectives with irregular comparative forms - rđav 'bad' and zao 'evil'), 2 ADV (adverbs gore 'worse' and gore 'up'), 6 N (all for one noun gora 'mountain'), 4 V (for two verbs - goreti and its jekavian equivalent gorjeti 'to burn'). This type appeared four
times in our text: in the 'swu' case as the two adverbs, and in the 'mwu' case as the simple adverb 'worse" and as a component of the compound adverb gore-dole 'up and down':

SR: Time gore \{gore,.ADV\} po sunce, gospodine!
FR: Tant pis pour le soleil, monsieur!
EN : So much the worse for the sun, monsieur.
SR: Paspartu je neprestano išao gore-dole \{gore-dole,.ADV\} po stepenicama kuće u Sevil-rou.
FR: Passepartout ne cessa de monter et de descendre l'escalier de la maison de Saville-row.
EN: Passepartout continually ascended and descended the stairs.
Table 6 shows some other types with a high number of grammatical tags assigned. All of them appear in the same way in both the 'swu' and the 'mwu' case, except for the last example železnička. Namely, in the 'mwu' case železnička appears only as a component of two compounds: železnička pruga 'railway' and železnička stanica 'railway station'. Moreover, to both of these multi-word unit types only one grammatical tag is assigned.

Table 6. Types with more than 24 grammatical tags assigned

| Type | freq. | No. of tags | PoS | No. of grammatical tags |
| :--- | :--- | :--- | :--- | :--- |
| Čuvena | 2 | 28 | $\mathrm{~A}, \mathrm{~V}$ | $24 \mathrm{~A}, 4 \mathrm{~V}$ |
| Ostala | 3 | 28 | $\mathrm{~A}, \mathrm{~A}, \mathrm{~V}$ | $24 \mathrm{~A}, 4 \mathrm{~V}$ |
| Kose | 2 | 27 | $\mathrm{~A}, \mathrm{~N}, \mathrm{~N}, \mathrm{~V}$ | $7 \mathrm{~A}, 19 \mathrm{~N}, 1 \mathrm{~V}$ |
| Soli | 2 | 26 | $\mathrm{~N}, \mathrm{~N}, \mathrm{~V}$ | $22 \mathrm{~N}, 4 \mathrm{~V}$ |
| Ista | 1 | 24 | $\mathrm{~N}, \mathrm{~N}, \mathrm{~A}, \mathrm{PRO}$ | $3 \mathrm{~N}, 12 \mathrm{~A}, 9 \mathrm{PRO}$ |
| Poveća | 3 | 24 | $\mathrm{~A}, \mathrm{~A}, \mathrm{~V}$ | $3 \mathrm{~V}, 21 \mathrm{~A}$ |
| Razna | 1 | 24 | $\mathrm{~A}, \mathrm{~A}$ | 24 A |
| Više | 8 | 24 | $\mathrm{~A}, \mathrm{~A}, \mathrm{ADV}, \mathrm{N}$, PREP, V | $20 \mathrm{~A}, 1 \mathrm{ADV}, 1 \mathrm{~N}, 1$ PREP, 1 V |
| železnička | 14 | 24 | $\mathrm{~A}, \mathrm{~A}$ | 24 A |

## 4 Conclusions and further work

As we have expected, tagging with multi-word units reduces the ambiguity of a text. The reduction obtained in the given example, assessed by means of different measures is, however, not substantial. Our experiment showed that the considerable benefit obtained for particular cases fades away when the text is perceived as a whole. One of the reasons is the under-development of dictionaries of compounds and tools for multi-word units like dictionary graphs. Besides enlarging the general dictionaries and tools, production and application of tools specific to an analyzed text could be of great use. For instance, the correct recognition in our text of only three compounds Fileas Fog 'Phileas Fogg', gospodin Fileas Fog 'mister Phileas Fogg', gospodin Fog
'mister Fogg', occurring 306, 8 and 309 times respectively, would improve our results significantly, since the number of simple words (and tokens) would be reduced by an additional 631. Our results also pointed out the types on which we should concentrate our efforts, e.g. looking for multi-word units with the most ambiguous components, such as po or gore, constructing ELAG grammars around these types, etc.

Our future work will proceed in several directions. First we will try to extract more statistical information on the dependencies of ambiguous solutions (in the line of work presented in (Baptista \& Faisca 2007)). Next, we will compare the ambiguous text with the text that has already been manually disambiguated in order to extract some useful information that could help to speed up the disambiguation process. Finally, we will try to add some practical solutions to the disambiguation process that rely on the high frequency of some specific two and three word sequences. For instance, the sequence kao što je occurs 4 times in our text and is always tagged as \{kao, CONJ\} \{sxto,.CONJ\} \{je,jesam.V+Imperf+It+Iref+Aux:Pzsi\}, although lexical resources offer two solutions for kao, four solutions for što, and three solutions for $j e$. The recognition of such unambiguously tagged sequences can have positive effects to the disambiguation process. The main benefit of this preliminary work is a step towards establishment of measures of ambiguity elimination that could be used for various approaches that we plan to work on in the future.

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[^0]:    ${ }^{1}$ English translations were obtained from http://www.gutenberg.org/files/103/103.txt.

