

SQAD: Simple Question Answering Database

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Definitions

Question answering:

- computer science discipline, which is concerned with building **systems** that automatically **answer questions** posed by humans in a **natural language**

Question answering system:

- **systems** that **process** the input question, **go through** a knowledge base and **provide** a reasonable answer to the input question

SQAD: Simple Question Answering Database

- developed for [accuracy evaluation](#) of question answering systems
- created from [Czech Wikipedia](#)
- created by students of computation linguistic course
- contains [3301](#) records

SQAD record

- **SQAD record** consists of:
 - the **original sentence(s)** from Wikipedia
 - a **question** that is directly answered in the text
 - the **expected answer** to the question as it appears in the original text
 - the **URL** of the Wikipedia web page from which the original text was extracted
 - **name** of the author of this SQAD record

Example of SQAD record

Example

Original text:

Létající jaguár je novela spisovatele Josefa Formánka z roku 2004.

[Létající jaguár is a novel of writer Josef Formánek form the 2004.]

Question:

Kdo je autorem novely Létající jaguár?

[Who is the author of the novel of Flying jaguar?]

Answer:

Josef Formánek

URL:

http://cs.wikipedia.org/wiki/L%C3%A9taj%C3%ADc%C3%AD_jagu%C3%A1r

Author:

chalupnikova

SQAD structure

Example

```
squad/1877/:  
  01question.txt  
  01question.vert  
  02answer.txt  
  02answer.vert  
  03text.txt  
  03text.vert  
  04url.txt  
  05author.txt
```

SQuAD: Automatic morphological annotation

- texts are **processed** by Unitok and Desamb tool
- to obtain **high-quality data**, the tagged texts were checked and corrected by **semi-automatic** and **manual adjustments**

SQuAD: Tokenization adjustments

- wrong tokenization for large numbers

Example

a)	<s>		b)
	1		
	200	→	<s>
	300		1 200 300
	</s>		</s>

Unitok: a) wrong and b) adjusted tokenization of number
"1 200 300".

SQAD: Out-of-vocabulary words

- the system Desamb is used for **morphological tags disambiguation** according to the word **context** and working over the attributive Czech tagset of the **Majka system**
- the Desamb tool cannot determine **correct tag** in this two main cases:
 - the context is too narrow
 - Majka system does not contain word form

SQAD: Out-of-vocabulary words

Desamb: Narrow context

- SQAD answers that contains only number
- we change “k?” (unknown tag) tag to “k4” (tag for numerals) if the word is number

Desamb: Narrow context

Example

$\langle s \rangle$

120 120 k? \longrightarrow $\langle s \rangle$ 120 k4

$\langle /s \rangle$ $\langle /s \rangle$

Desamb: unrecognized number

SQAD: Out-of-vocabulary words

Desamb: Unrecognized word form

- Majka does not recognize all existing words, especially **proper names** and **abbreviations**
- for unrecognized words Desamb system returns “**k?**” (unknown tag) as a resulting tag
- for **proper names** and **abbreviations** we changed the unknown tag to:
 - “**k1**” (nouns) for all words that start with an upper case letter
 - “**kA**” (abbreviations) for words that contains only upper case letters, words ending with dot or words containing dots between upper case letters

SQAD: Out-of-vocabulary words

Desamb: Unrecognized proper names and abbreviations

Example

<s>				<s>		
Los	Los	k?		Los	Los	k1
Angeles	Angeles	k?		Angeles	Angeles	k1
</s>			→	</s>		
<s>				<s>		
LA	LA	k?		LA	LA	kA
</s>				</s>		

Desamb: unrecognized proper names and abbreviations

SQAD: Out-of-vocabulary words

Desamb: Unrecognized word form

- SQAD database is extracted from Czech Wikipedia and contain **original forms** of proper names

Example

Original form of word “Tokio” is “東京”

- we extracted remaining unknown words into one **file** keeping the **original file name**, **word position** and **unknown word** with its **lemma** and **tag** from Desamb
- the file was then **manually annotated** and **programmatically applied back** to the original annotated file

SQAD: Out-of-vocabulary words

Manually annotated file

Original Desamb output stored in file 03text.txt:

Example

Tokio	Tokio	k1glnSc1
((klx(
jap.	jap.	kA
東京	東京	k?

Record of unknown word extracted from 03text.txt file:

Example

./0000/03tex.txt|3|東京 東京 k?

SQAD: Out-of-vocabulary words

Manually annotated file example

Record from 03text.txt with manual changes:

Example

```
./0000/03tex.txt|3|東京 東京 k1
```

File 03text.txt with changes:

Example

Tokio	Tokio	k1glnSc1
((klx(
jap.	jap.	kA
東京	東京	k1

SQAD: Mistakes in morphological analysis

- wrong lemma for foreign words

Example

For word "Las" (from proper name "Las Vegas") the **output** of Desamb is "Las laso k1glnSc1"

- we checked all the SQAD database records and extracted a file with **morphological analysis mistakes**
- the file was than **manually annotated** and **programmatically applied** back to the original annotated file

SQAD

Table : SQAD mistakes

mistake type	number of found mistakes
out-of-vocabulary words	618
morphological analysis	160

SBQA: Syntax-based question answering system

- we used the SQAD database to **evaluate the accuracy** of a first version of SBQA
- the SBQA system was developed by M. Pavla at Faculty of Informatics, Masaryk University
- input of SBQA system is a **plain text question** which is then preprocessed by Unitok and Desamb system and passed to SET parser to **identify dependencies** and **phrase relations** within the question
- SBQA finds the answer in its **knowledge base** based on a match on **corresponding syntactic structures**
- SBQA knowledge base is made from **plain text documents**, which are automatically processed with Unitok, Desamb and SET
- to evaluate SBQA we use **SQAD database** as a knowledge base

Evaluation

Table : Evaluation of SBQA system

total questions	correct	partially correct	incorrect	not found
3,301	758	60	2,003	480
100%	23%	1%	61%	15%

Classification of SBQA errors

- we manually checked 200 questions and find:
 - errors in **implementation** of SBQA system
 - errors in **tokenization** or syntactic analysis
 - **phenomena** not covered by the current **implementation** of SBQA system

SBQA: Errors in implementation

- we have identified the following **error types** that are caused by SBQA implementation:
 - answer in brackets
 - part of speech requirement
 - comparison of dates or numbers
 - wrong question type

Answer in brackets

Example

Text: Ing. Miloš Zeman (* 28. září 1944 Kolín) je český politik.

[Ing. Miloš Zeman (* 28. September 1944 Kolín) is a Czech politician.]

Question: Kde se narodil Miloš Zeman?

[Where was Miloš Zeman born?]

Original answer: Kolín

SBQA answer: který na Novém Zélandu

[which in New Zealand]

Part of speech requirement

Example

Text: Hlaholice je nejstarší, dnes již neužívané slovanské písm.

[Glagolitsa is the oldest, not being used today, Slavic writing system.]

Question: Co je nejstarší slovanské písmo?

[What is the oldest Slavonic writing system?]

Original answer: Hlaholika

[Glagolitsa]

SBQA answer: písmo staroevropské civilizace

[writing system of the Middle-European civilization]

Comparison of dates or numbers

Example

Text: George Walker Bush je bývalý 43. prezident Spojených států amerických.

[George Walker Bush was 43. president of United States of America.]

Question: Byl George W. Bush 40. prezidentem Spojených států amerických?

[Was George W. Bush 40. president of United States of America?]

Original answer: Nie

[No]

SBQA answer: Ano

[Yes]

Wrong question type

Example

Text: Angličtina patří do skupiny západogermánských jazyků.

[English language belongs to group of West Germanic languages.]

Question: Do skupiny jakých jazyků patří Angličtina?

[To which group of languages the English language belongs to?]

Original answer: západogermánských

[West Germanic]

SBQA answer: Ano

[Yes]

SBQA: Errors in tokenization, tagging or syntactic analysis

- there are three types of such **errors** that appear in the current SQA database:
 - Unitok incorrectly detects **sentence boundaries** and splits one sentence into two or more sentences
 - Desamb incorrectly **tagged** a word thus the syntactic analysis is incorrect and SBQA system cannot derive the **required answer**
 - SET incorrectly **parses** a sentence and creates an **incorrect syntactic tree**. This usually leads to incorrect answer.

Error in tokenization

Example

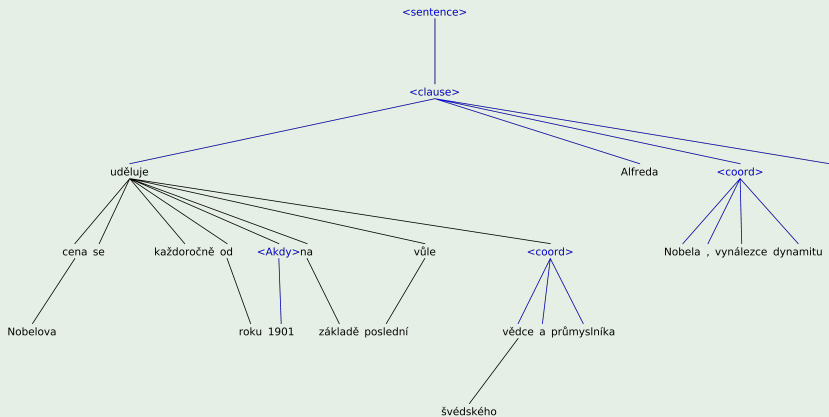
Text: Lilongwe je hlavní město afrického státu Malawi.

[Lilongwe is a capital city of African state Malawi.]

Lilongwe	Lilongwe	k6eAd1
je	být	k5eAaImIp3nS
hlavní	hlavní	k2eAgNnSc1d1
město	město	k1gNnSc1
...		

Error in syntactic analysis

Example



SBQA: Uncovered phenomena

- the SBQA system has not yet implemented **advanced** NLP techniques such as **anaphora resolution**

Evaluation

Table : Classification of SBQA errors (on 200 examples)

total questions	error in SBQA system	error in tokenization or syntax analysis	uncovered phenomena
200 100%	119 59.5%	43 24.5%	38 19%

Conclusions

- we have presented new Czech question answering database called SQAD
- SQAD record consists of an **annotated question**, the **annotated answer**, the **annotated sentence** containing the full answer, Wikipedia **URL** as a source of the statement and the **author name** of this question-answer pair
- **morphological annotation** of SQAD was obtained automatically and manually corrected

Future Directions

- improve SQAD database
- according to SQAD database refine SBQA system
- add new phenomena into SBQA system

Thank you for your attention.