Language Understanding Systems

Mid-Term Project: FST & GRM Tools for SLU

Evgeny A. Stepanov

SISL, DISI, UniTN evgeny.stepanov@unitn.it

Objective

Develop Concept Tagging Module for Movie Domain using NL-SPARQL Data Set

who plays luke on star wars new hope

```
Concept Tagging

who 0
plays 0
luke B-character.name
on 0
star B-movie.name
wars I-movie.name
new I-movie.name
hope I-movie.name
```



IOB Notation

The notation is used to label *multi-word* spans in token-per-line format. Both, prefix and suffix notations are commons: B-NP vs. NP-B

- ullet B for Beginning of span
- I for Inside of span
- O for Outside of span
- Sometimes **E** for **E**nd of span

who	0
plays	0
luke	B-character.name
on	0
star	B-movie.name
wars	I-movie.name
new	I-movie.name
hope	I-movie.name



Tools

Develop Concept Tagging Module for Movie Domain using NL-SPARQL Data Set

Sequence Labeling

- OpenFST
- OpenGRM



Data Set

NL-SPARQL Data Set https://github.com/esrel/NL2SparQL4NLU

Sequence Labeling

- Token-per-line
 - words (tokens)
 - concept tags (IOB-format)
- Additional Features (optional to use)
 - POS-tags (automatic)
 - Lemmas (automatic)



Tasks: Minimum

Train Concept Tagger

Sequence Labeling

- FST&GRM
 - Train WFST & LM
 - Experiment with different Language Model parameters
 - ngram size
 - smoothing
 - Take care of **unknown** words
 - e.g. lexicon frequency cut-off
- Evaluate with conlleval.pl
 - https://github.com/esrel/LUS/ (extras)





Tasks: Improvements (2018)

Issue

Language Model trained on tags only: the majority is 'O'

- Train LM using the words & concept tags
- Implement the tagging pipeline to make use of that
- Evaluate and compare

Expected Performance: $F_1 \approx 83$ (Gobbi et al., 2018)



Tasks: Improvements (2019)

Issue

- Sparsity for certain classes.
- Overlap for certain classes (e.g. 'actor' & 'director')

Entity Recognition + Concept Tagging

- Explore NER for NLU (use https://spacy.io/)
- Generalize words (phrases) to entities prior to concept tagging (add a transducer)
- External resources like gazetteers are allowed to be used
- experiment on different entity sets

Expected Performance: unknown



Tasks: Improvements (2019)

Example

```
how many woody allen movies starred diane keaton how many person.name movies starred person.name 0 0 actor.name
```



To Submit

REPORT (\approx 4 pages) that includes:

- Data Analysis
 - Data size
 - Distribution of concepts (not IOB-tags)
 - etc.
- Evaluation (with Baseline)
- Comparison of different training parameters and settings
- Error Analysis
- Discussion

CODE with readme (e.g. GitHub link)

https://github.com/esrel/LUS/ (extras)

