# EPE 2017: The Trento-Gothenburg Opinion Extraction System



#### **CHALMERS**

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#### the third EPE downstream task

- the third task is extraction of opinion expressions
- ▶ we use the MPQA annotation model [Wiebe et al., 2005] "The report is full of absurdities", Xirao-Nima said.
- ▶ the downstream application is the Trento–Gothenburg system [Johansson and Moschitti, 2013]



# types of expressions annotated in MPQA

direct-subjective expressions (DSEs):

Paolo likes Pisa

expressive-subjective elements (ESEs):

Pisa is a wonderful city

objective speech events (OSEs):

Paolo says that Pisa is widely appreciated



### polarity annotation

- direct-subjective expressions (DSEs):
  - Paolo likes Pisa [positive]
- expressive-subjective elements (DSEs):
  - Pisa is a wonderful city [positive]
- objective speech events (OSEs):
  - Paolo says that Pisa is widely appreciated



# opinion holders

explicitly mentioned:

Paolo likes Pisa

writer:

Pisa is a wonderful city

implicit:

Pisa is widely appreciated



#### definition of the task

- extract expressions and label them (DSE, ESE, OSE)
- determine the polarity of DSEs and ESEs
- find the holders of all expressions, including writer and implicit



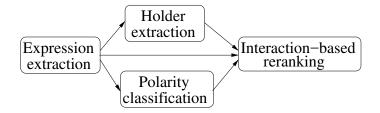
## scoring the participating systems

- precision, recall, and F-score for all three subtasks
- we use a lenient scoring approach:
   gold standard: The report is full of absurdities
   system output: The report is full of absurdities

gives P = 1.0, R = 0.58



# overview of the system by Johansson and Moschitti (2013)



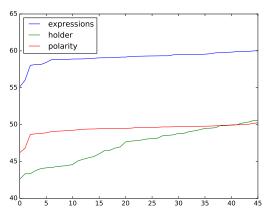


# how does the linguistic analysis affect the modules?

- expression extraction: tags, lemmas
- polarity classification: tags, lemmas
- holder extraction: tags, lemmas, dependencies
- reranking: tags, lemmas, dependencies



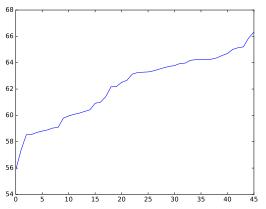
# results: high-level trends



 holder extraction results show much more variation than the other two subtasks



#### detailed results: "in vitro" holder extraction



- we evaluated the holder extraction module using gold-standard opinion expressions
- this is the scenario we used in the final overall ranking

#### honorable mentions

```
Szeged 1 66.3 post-processed CoNLL-08
Stanford-Paris 6 65.2 UD v1 enhanced
Paris-Stanford 3 64.3 UD v1 enhanced
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#### conclusions: some tentative observations

- how much does the choice of dependency style matter?
  - hard to say: most systems are UD-based, but much variation inside this group
  - not many datapoints for other dependency styles
- how well do parsers producing "semantic" representations perform?
  - not very well! mean F-score 58.8, vs 62.9 for the "syntactic" representations
  - but the features in the downstream system were never designed for this type of representation



#### references I

- Johansson, R. and Moschitti, A. (2013). Relational features in fine-grained opinion analysis. *Computational Linguistics*, 39(3):473–509.
- ▶ Wiebe, J., Wilson, T., and Cardie, C. (2005). Annotating expressions of opinions and emotions in language. *Language Resources and Evaluation*, 39(2-3):165–210.