

- 1. Focus is on extracting a large number of relations
- 2. Handles the problem of sparsity by learning lexicons for each relation from webists
- 3. Hints at hierarchical extraction, first a classifier is trained that prunes out pages which are likely to contain a relation,
- 4. For each attribute a linear chain CRF is trained, relation extraction is treated as a sequence labelling problem.
- 5. For numerical relations, include a feature that models closeness.
- 6. We can exploit their idea of first finding out the high level classes.

- 1. Introduced DS
- 2. DS Assumption
- 3. Sentence level Naive Bayes Classifier

Craven and Kuntlien, 1999

Distance supervision for the web

Mintz. et al 2009

Increase the number of relations

Learning 5000 relation extractors [LUCHS]

- 1. 102 Freebase relations + Wikipedia
- 2. Distance Supervision Assumption
- 3. Entity Pair Focussed Approach, not sentence level extraction
- 4. Multiclass LR

Relax the DS Assumption

Riedel et. al. 2010

More than one relation for an entity pair

Hoffman et al 2011 [MultiR]

- 1. Builds up on the graphical model of Riedel et. al
- 2. Let an entity pair participate in more than 1 relation (Multi R)
- 3. Online training, approximate expectation by max. Reduce inference to known problems.

Model missing data

Smarter entity detection, type constraints while extracting

Ritter et. al. 2013 [DNWMR]

- The following 2 assumptions
  - a. If a relation does not exist in knowledge base, then there won't be any sentence which expresses it.
  - b. If a relation exists in knowledge base, there will be atleast one sentence that expresses it
- Lead to false negatives and false positives respectively,

More than one relation for an entity pair

Surdeanu et. al 2012 [Stanford NLP]

Handling large number of False negatives in automatic labeling

- 1. Similar motivation and model as MultiR, differs in training

Min et. al 2013 [DS with incomplete KB]

- 1. Authors argue that a large number of labeled examples are false negatives
- 2. Algorithm that learns from only positive and unlabeled labels at the entity-pair level

- 1. Relation holds in atleast one of the sentences that contain the entity pair.
- 2. Also allow sentence level extraction

Koch et al 2014

- 1. Hitherto, the named entity matching has been adhoc. The authors explore coreference resolution and named entity disambiguation.
- 2. During relation extraction, coarse type constraints are imposed to improve precision