# Automatically Creating a Lexicon of Verbal Polarity Shifters: Mono- and Cross-lingual Methods for German



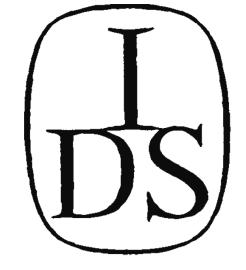
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## INTRODUCTION

**POLARITY SHIFTERS** Shifters are content words that affect polarities in ways that are very similar to negation words like *no*, *not*, *neither*, etc.



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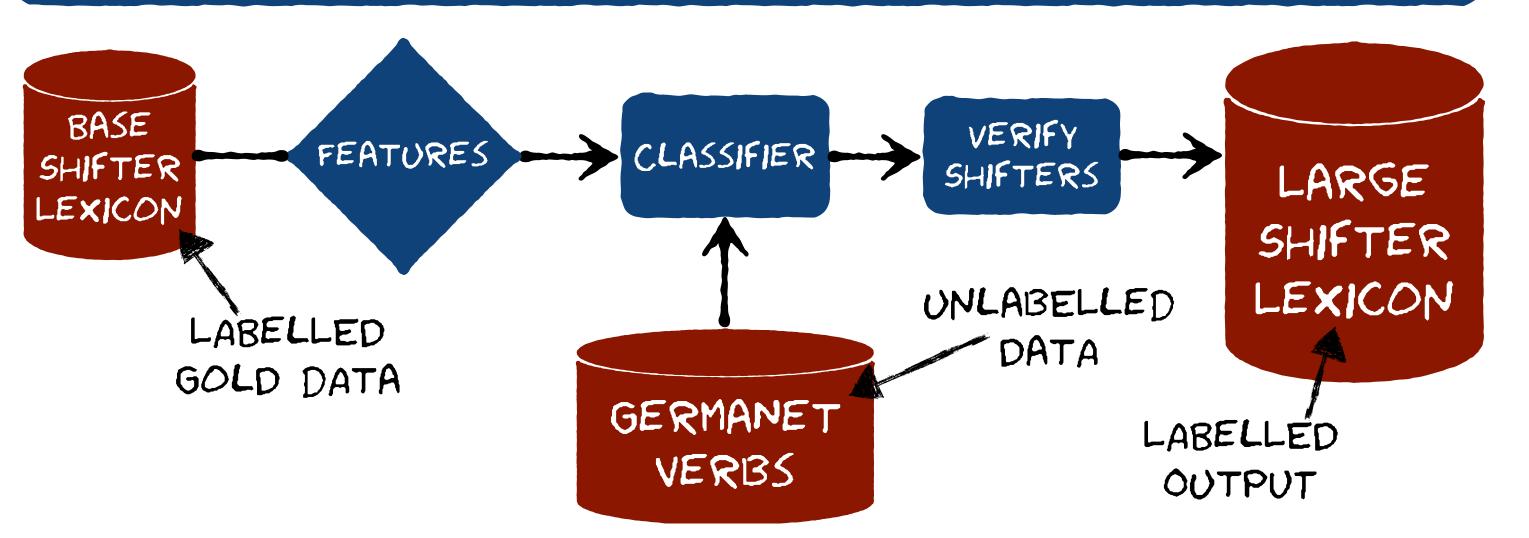


EVALUATION

Classifier	Prec	Rec	<b>F1</b>
မွှ Majority Label	44.4	50.0	47.0
Del Propagation	67.2	65.0	66.1
© Cross-lingual Embedding	67.6	74.6	70.9
🗧 Bilingual Dictionary	69.2	77.3	73.0
Data	60.8	72.6	66.2

**Goal:** A list of German verbs that are polarity shifters. **Uses:** NLP tasks affected by negation, e.g. polarity classification.

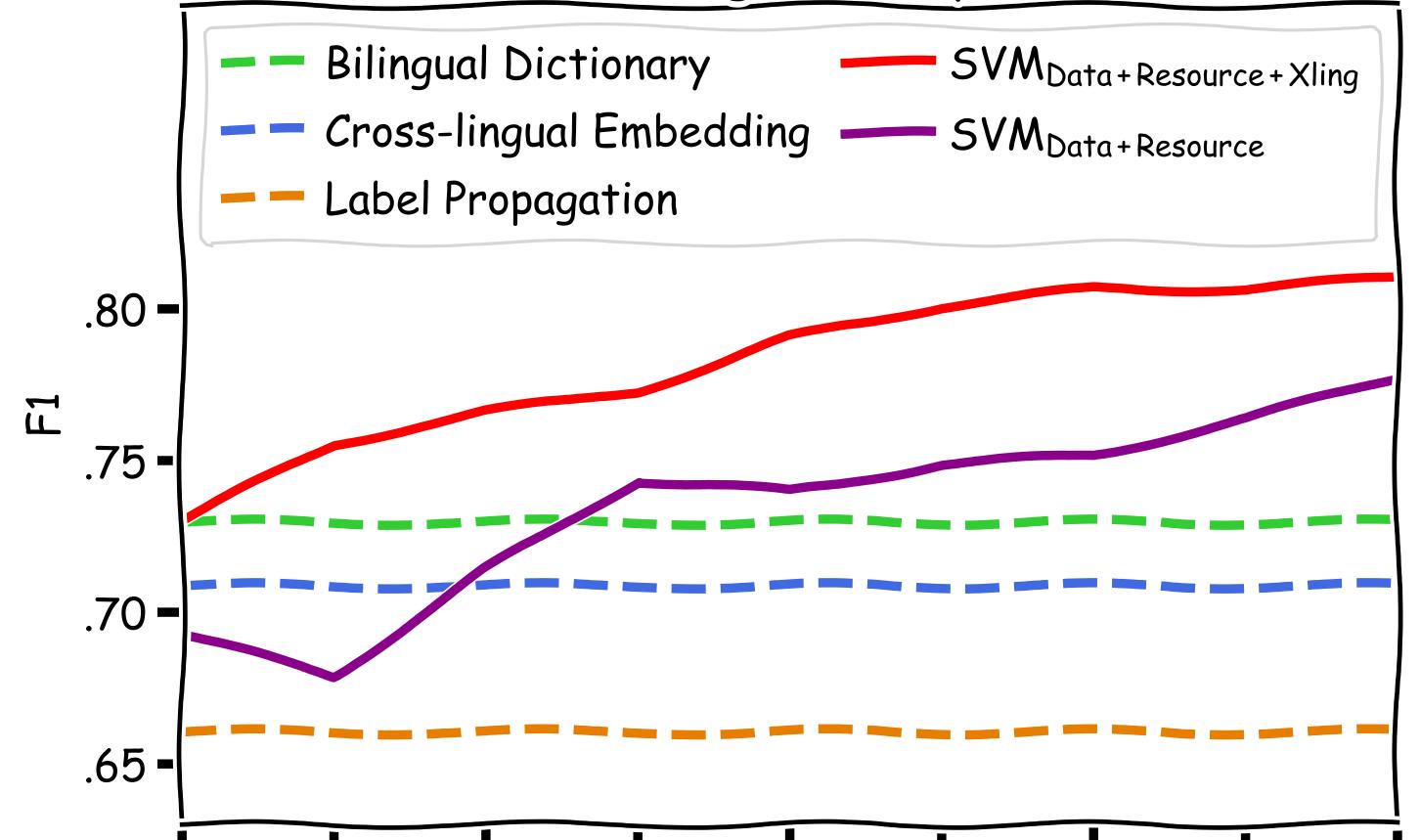
## BOOTSTRAPPING APPROACH



Task: Binary classification: Shifter vs Non-shifter Gold Data: 2000 German verbs (11% shifters). Unlabelled Data: 7262 German verbs.

≥ Resource	79.4	73.9	76.4
S Data+Resource	79.0	76.7	77.7
Data + Resource + Xling	80.3	82.0	81.0

#### Effect of training size on performance



#### Source Features

Data Similarity to Negation, Polarity Clash, Verb Particles, Co-occurrence with *any*, Anti-Shifter

Resource GermaNet, Salsa FrameNet, EffektGermaNet

Xling Bilingual Dictionary, Cross-lingual Embedding

Will this work? It does for English (Schulder et al., IJCNLP 2017).What's new? Applied to German, added cross-lingual features.Why not deep learning? Not enough data!

## RESULTS

Output: Lexicon of 677 German verbal shifters. Data: https://github.com/uds-lsv/coling2018 Lessons learned:

- Classification of shifters works for German, too.
- Cross-lingual features are strong feature addition.



 10%
 20%
 30%
 40%
 50%
 60%
 70%
 80%
 90%

 Amount of gold data used for training

### 

Dictionary limited to the n most frequent English verbs

• Dictionary and embeddings are both useful.

## FUTURE EXTENSION TO OTHER LANGUAGES

