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A Multilingual Benchmark for Probing Negation-Awareness with Minimal Pairs

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We generate NLI probing datasets based on minimal pairs in 5 languages.

Minimal Pairs

Premise

Hypothesis

He was **not** a nice man.
He was ~~not~~ a nice man.

He was the nicest man you'll ever meet! **✗** C
He was the nicest man you'll ever meet! **?** N

She was **not** impressed by the signs.
She was ~~not~~ impressed by the signs.

It was certain that she saw the signs. **✓** E
It was certain that she saw the signs. **✓** E

Important negation
Is the model aware of negation?

Unimportant negation
Does the model exploit negation as lexical cue?

Creating the Datasets

1 Compile lists of negation cues

- no, not, never, nobody, without, ...
- не, никогда не, няма. никой не, нямаше, ...
- nicht, keine, nie, nichts, niemand, ...
- ne pas, jamais, aucun, rien, ne plus, ...
- 不, 没, 未, 没有, 从来没有, ...

2 Match XNLI examples

Match examples with
at most one cue in **premise** and **at most** one cue in **hypothesis**

- ✓ P: I do **not** own a bike. H: I do **not** own a car.
- ✗ P: **Never** mind, I do **not** own a bike. H: I own a bike.

3 Rewrite or discard

- ✓ They have written ~~anything~~ something about it.
- ✗ **Never** mind the question about it.
- ✗ My friend is deaf, so he cannot ~~not~~ listen to music.

4 Relabel

P: They were **not** impressed by the signs. **✓** E → **✓** E
H: It was certain that they saw the signs.

Adding vs Removing Negation

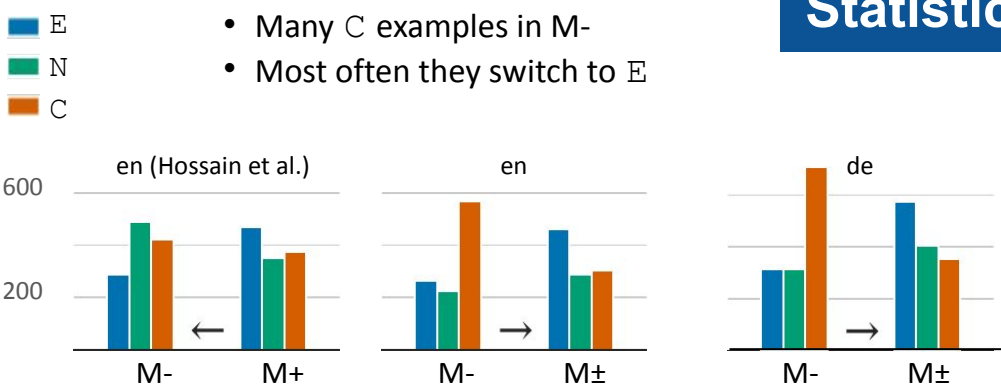
- We build our minimal pairs by **removing** negation

$M^- \rightleftharpoons M^\pm$

- Hossain et al. (2020) **add** negation by inserting not to negate the main verb

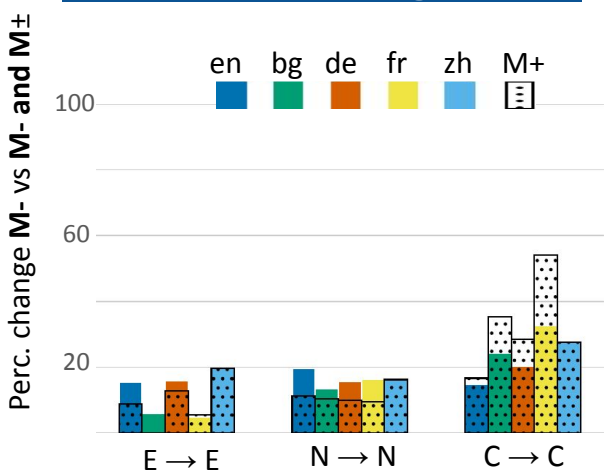
$M^+ \rightleftharpoons M^-$ (English only)

Statistics



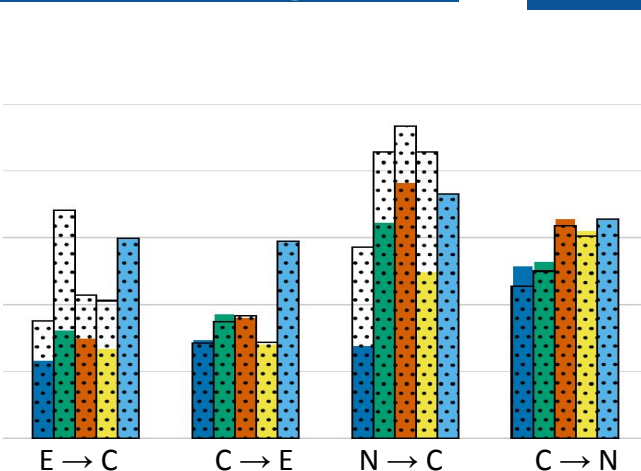
We probe mBERT fine-tuned for NLI on our datasets.

Unimportant Negations



- Negation (mismatch) indicates C class
Dasgupta et al. (2018)
Poliak et al. (2018)
Gururangan et al. (2018)
McCoy and Linzen (2019)
- Bias transfers across languages

Important Negations



- E ↔ C switch is easier than N ↔ C
- Possible explanation: high Pr-Hypo. overlap for E and C classes
Dasgupta et al. (2018)
Naik et al. (2018)
McCoy et al. (2019)

Probing mBERT