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The Extraordinary Failure of Complement Coercion Crowdsourcing

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Crowdsourcing for Data Collection

- Crowdsourcing has become extremely popular in recent years
- It is used to collect both simple and complex linguistic annotations
- E.g. Sentiment, NLI, QA-SRL, ...



Crowdsourcing Complement Coercion

- In this work, we aim to crowdsource data for the complement coercion phenomenon
- ... and achieve low agreement scores
- Why does this happen?

Complement Coercion

- Constructions that involve an implied action. E.g.:
 - "I **started** __ a new book."
 - ... started reading/writing/... (but not eating)
 - "I **started** __ a new book I bought last week."
 - ... **started** *reading* (but not writing)

Complement Coercion

- Constructions that involve an implied action. E.g.:
 - "I **started** __ a new book."





Complement Coercion

- Constructions that involve an implied action. E.g.:
 - "I **started** __ a new book."





• "I **started** __ a new book I bought last week."





RTE/NLI As Evaluation Framework

The PASCAL Recognising Textual Entailment Challenge

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A large annotated corpus for learning natural language inference

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RTE/NLI As Evaluation Framework

Premise/Hypothesis	Label
The man is holding a saxophone The man is holding an electric guitar	contradiction ¹
A little girl is very sad. A little girl is very unhappy.	entailment
A couple drinking wine A couple drinking champagne	neutral

Complement Coercion - NLI*

- "I **started** a new book."
- "I **started** a new book I bought last week."



Neutral

Contradict

Contradict

Complement Coercion Data

- We collect sentences that contain *aspectual verbs* such as: *start*, *begin*, *continue* and *finish*
- ... where the aspectual verb is attached to another verb
- *"it was pike's idea to start playing these games." Hypothesis*

Complement Coercion Data

- We collect sentences that contain *aspectual verbs* such as: *start*, *begin*, *continue* and *finish*
- ... where the aspectual verb is attached to another verb
- *"it was pike's idea to start playing these games." Hypothesis*
 - *⊶" it was pike's idea to start playing these games."* Premise

NLI Crowdsourcing

- We collect labels using Amazon Mechanical Turk
- We follow standard methodologies
- We got **0.24** Kappa



NLI Crowdsourcing

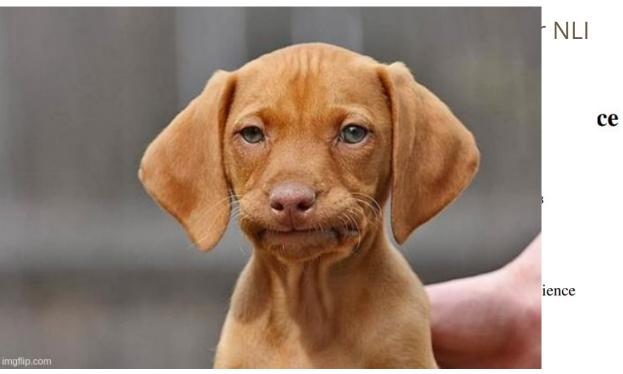
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NLI Crowdsourcing

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Disagreements

- "... as the young man **finished** his case."
- ... as the young man **finished** *pleading* his case."



Disagreements

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Disagreements

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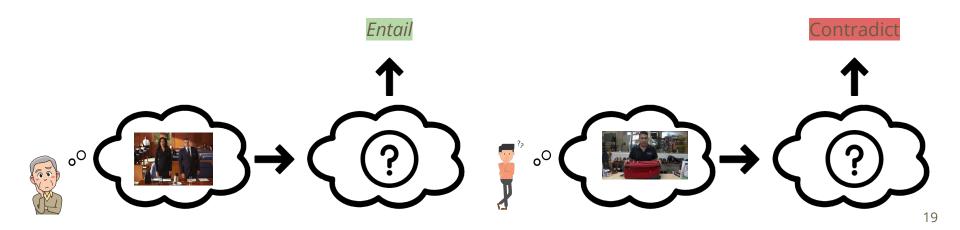
Trott et al. (2020) define *construals*:

• *"The dynamic process of meaning construction, in which speakers and hearers encode and decode, respectively, some intended meaning in a given*

communicative context"

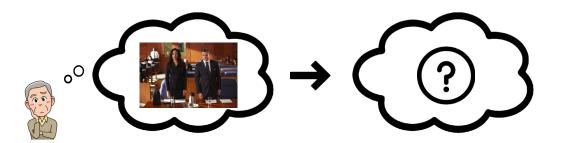


- The complement coercion Instances allow for multiple *construals*
- Once fixating on a scenario, it is hard to imagine others



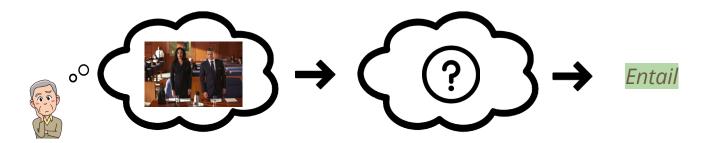


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- The complement coercion Instances allow for multiple *construals*
- Once fixating on a scenario, it is hard to imagine others
- Which results in different labels, based on the *construal* the reader holds



- Multiple construals is an under-explored scenario in today's NLP
- We observe it in the *complement coercion* phenomenon
- This is an interesting future research direction

Pitfalls in NLI Data Collection

• Short and loose task definition

Task Definition

- · Carefully read the two given sentences
- · The two sentences are identical apart from a verb that was dropped
- You will be asked to answer three questions: Do the sentences describe the same event?
 Does the new sentence add new information to the original sentence? Is the first sentence incorrect/ungrammatical?

Make sure to read all the examples and their explanations to get a notion of the different cases

Pitfalls in NLI Data Collection

- Short and loose task definition
- Minimal annotators training and reliance on common-sense

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Pitfalls in NLI Data Collection

- Short and loose task definition
- Minimal annotators training and reliance on common-sense
- AMT as a platform does not allow discussion between annotators

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Conclusions

- Certain phenomena may highlight difficulties, which are not revealed in large-scale "general" data collection
- The **common** methodology for NLI crowdsourcing is suboptimal
- Multiple *construals* is an under-explored scenario, which will require

tailored solutions, also in data collection

Thanks

(For reaching this point)

See you at the Q&A Session!









Complement Coercion - Disagreements

• Pavlick and Kwiatowski, 2019 found a similar phenomenon of

disagreements in NLI

• However, these are due to a different phenomena, which has to do with

people's situation interpretation

p: Someone confessed that a particular thing happened.h: That thing happened.

