# Crowd-Sourcing Concurrent Relations

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# Signalling discourse relations

Conjunctions

"We've started trying just about anything to keep sales moving in the stores," says Kim Renk, a Swank vice president." <u>But</u> there are limits." [WSJ]

Adverbials

They both called it a "welcome home" gathering.

Nevertheless, an ANC rally by any other name is still an ANC rally. [WSJ]

This talk: Cases in which more than one relation can hold

#### **Concurrent relations**

In school he was assigned regular essays to write, but instead he wrote poetry. [NYTimes 2002]

Mentioning the word sex on daytime television was taboo at the time, she recalled, so instead she simply held up the book cover to the camera. [NYT 2001]

So many people have come that Jeff LeDuff, the police chief here, has said that city officials will no longer be able to transport and place evacuees within the city <u>and instead</u> they will be sent to adjacent regions. [NYT 2005]

Humans have lost some stereotypic calls because instead they can shout *Danger* or *Leopard* or *Watch out*, much more efficiently than calls [Bouchard, 2013]

-> Conjunction and adverbial can signal distinct relations

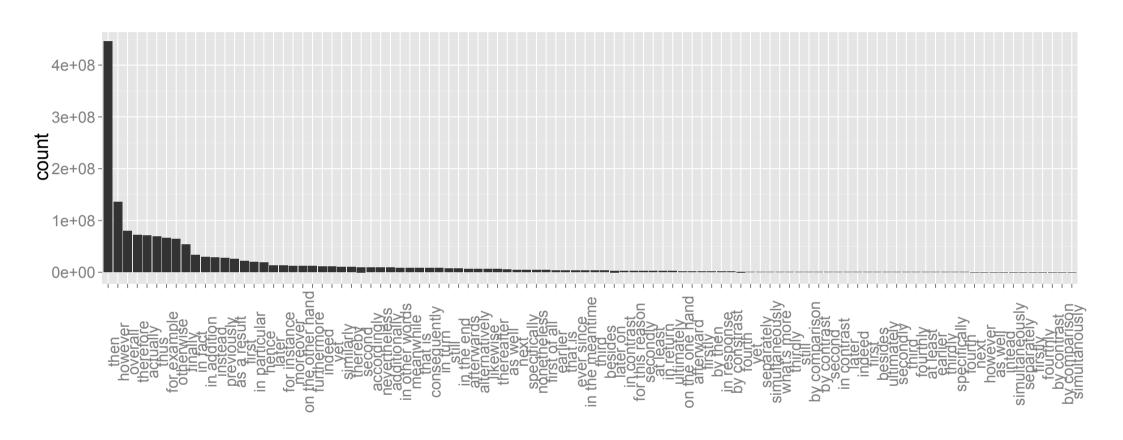
#### **Motivations**

- A lexically-based system like PDTB calls attention to the existence of multiple DRDs (see also Webber et al., 1999)
- These cases do not involve relations at different levels.
- Existing DRD theories do not predict such cases
- A better understanding of concurrent relations is relevant to
  - Corpus annotation
  - Psycholinguistics
  - Language technologies

#### How to assess concurrent relations?

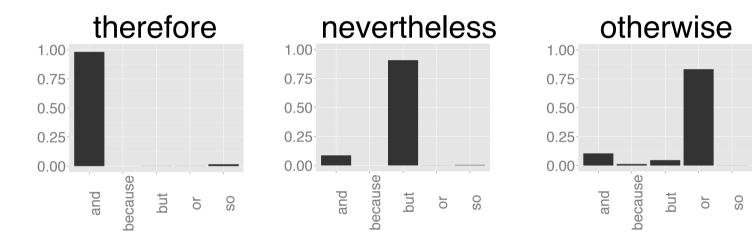
- Google Ngrams
  - Frequency of discourse adverbials
  - Frequency of adverbials accompanied by conjunction
  - Possibility of same adverbial with different conjunctions
- Annotator judgments, collected via a web interface [pilot results]

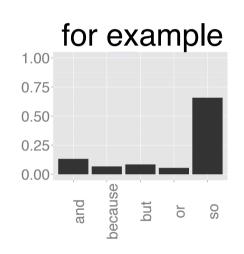
# Frequency (Google Ngrams)



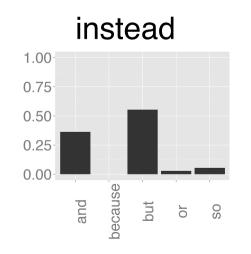
### Adverbials and the conjunctions they prefer

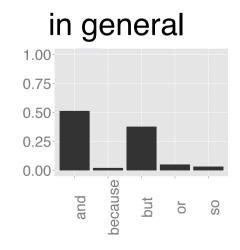
- All adverbials occur most frequently alone.
- But with conjunctions, many have clear preferences.

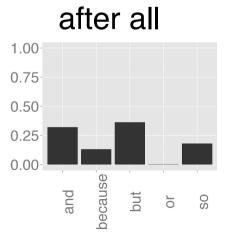


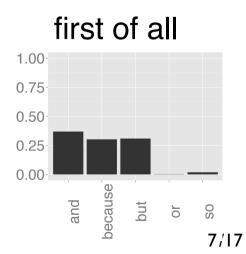


Whereas others have a broader distribution









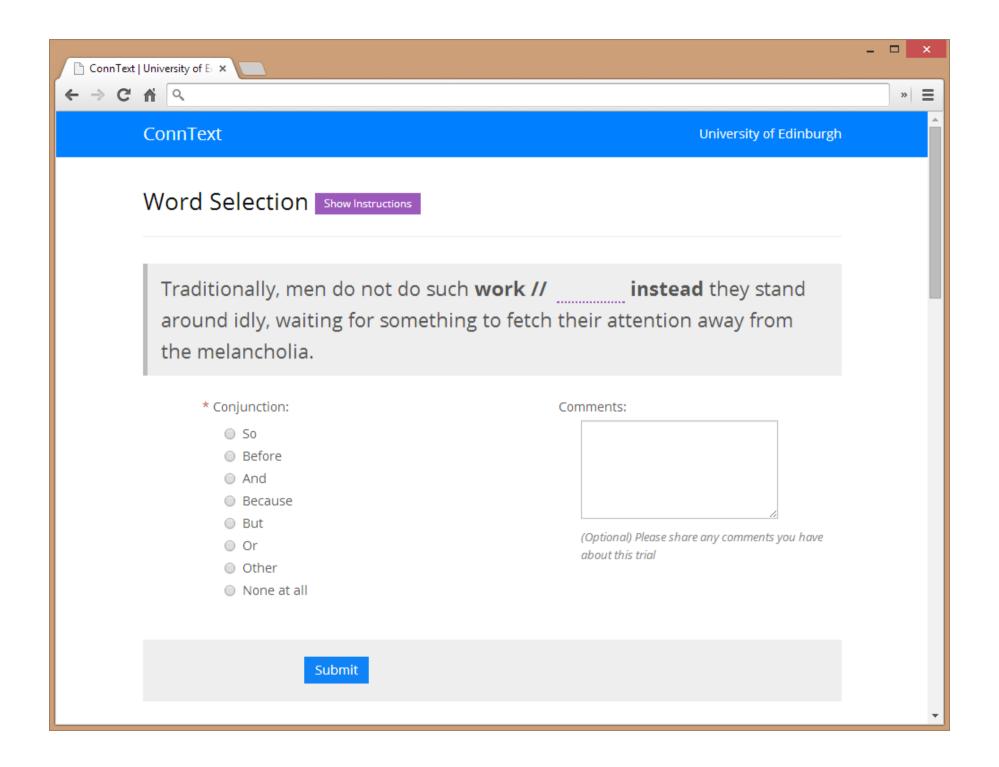
#### What about bare adverbials?

Mentioning the word sex on daytime television was taboo at the time, she recalled, \_\_\_\_\_ instead she simply held up the book cover to the camera.

- ▶ Jiang 2013: 4 adverbials
  - ▶ 80 passages, each viewed by 52 judges
  - Task: select a conjunction to fill a blank
- Jiang results: Adverbials differ from each other.
  - "After all" has an overall preference for "because"
  - "Instead" varies passage-by-passage
- No adverbial favored no conjunction.
- Shows that even without an explicit conjunction, two separate senses can be concurrently conveyed.

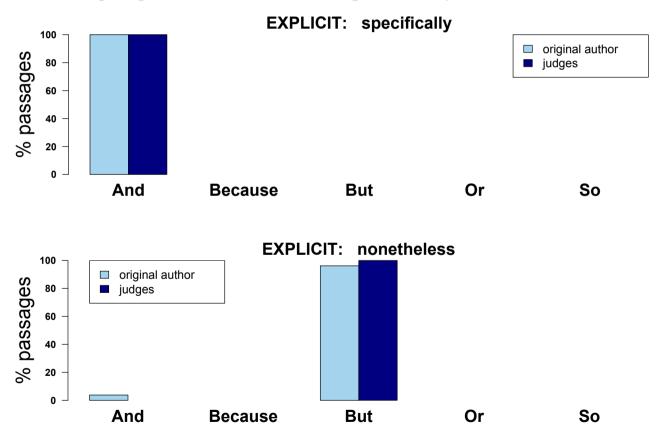
## ConnText project

- Funded by small grant from Nuance Foundation
- ▶ Goal: Establish which discourse adverbials can co-occur with conjunctions and which conjunctions each adverbial licenses and favors
- Pilot study: 20 adverbials, 3 judges, 895 unique passages from the NYTimes Annotated Corpus (Sandhaus, 2008) and COCA (Davies, 2008)



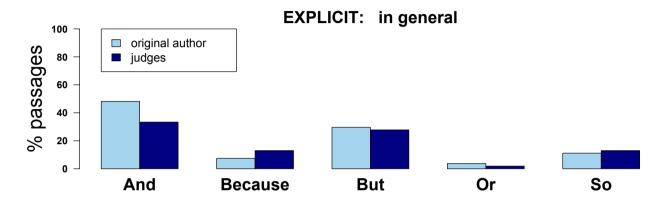
## Results: Explicits

- Dataset = 1507; Agreement with author: 19% ~ 100%
- Cases of strong agreement on single conjunction

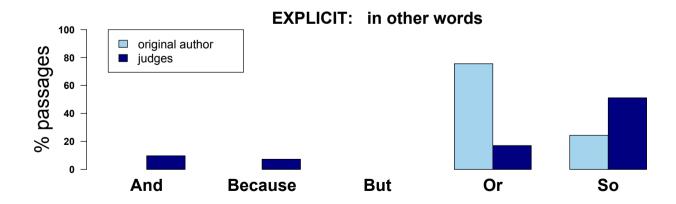


# Explicits

Strong agreement on different conjunctions



Strong disagreement with author



## Example: disagreement among judges

'Ms. Morissette went through bouts of depression as the tour stretched on. "Schedule-wise, my health and my peace of mind wasn't a priority," she said. "There had been this dissonance in the midst of all the external success \_\_\_\_\_ on the one hand, I was expected to be overjoyed by it, and at the same time I was disillusioned by it." [NYTimes 1998]

[original: "because"]
[judges: "because", "and", "so"]

## Results: Implicits

- Dataset=780 judgments
- Agreement across 3 judges: 64% ~ 90%

Some software automatically moves the pointer to the default button on a pop-up window \_\_\_\_ otherwise the user must move the pointer to that button or hit Enter (using the left hand or letting go of the mouse).

[original: none]
[judges: "but", "because", "none"]

# Sources of judgment variation

Interpretation of instructions (sense vs style)

"Your job is to make explicit the meaning that links the adjacent text spans. You must make a choice even if the insertion leads to an awkward or lengthy sentence, as long as you think the word brings out the meaning that links the two spans."

- Reduced context as basis for judgment
- Specificity of conjunctions (and/so)
- Idiosyncrasies (or otherwise/because otherwise)

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You got to be nice to them _____ otherwise, they're not going to be nice to you. [COCA 1991]
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```
[original: "or"]
[judges: "because", "because"]
```

## Summary (& open questions)

- In contrast to models of DRD usage that assume that each pair of clauses = one relationship, discourse adverbials:
  - Do not always act alone (because after all)
  - Need not license only one additional relation (but/so/and/because instead)
  - Differ in the way they combine with possible conjunctions (single preference vs context-driven flexibility)
- Categories of discourse adverbials?
- Crowdsourcing as discovery tool?
- Other languages?

