# **Computational Semantics and Pragmatics**

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Autumn 2016

## Linguistic coordination

Three different approaches to explaining coordination of linguistic forms:

- driven by communicative goals and the need for mutual understanding
- consequence of our *cognitive* architecture, triggered by priming mechanisms
- driven by social goals, to negotiate social distance

#### To read for discussion today :

C. Danescu-Niculescu-Mizil, L. Lee, B. Pang and J. Kleinberg (2012). Echoes of power: Language effects and power differences in social interaction, *Proceedings of WWW*.

Reitter & Moore (2014), Alignment and task success in spoken dialogue,  $\it Journal\ of\ Memory\ and\ Language$ .

 $\hookrightarrow$  Shorter older version: Reitter & Moore (2007). Predicting Success in Dialogue, ACL.

C. Danescu-Niculescu-Mizil, L. Lee, B. Pang and J. Kleinberg (2012). Echoes of power: Language effects and power differences in social interaction, *Proceedings of WWW*.

- 1. Which forms of power are considered?
- 2. Which domains/datasets are are used to investigate these forms of power?
- 3. What are the theoretical assumptions / hypotheses tested?
- 4. What's the measure of linguistic style coordination used?
- 5. What are the results for each domain and form of power?

# Style Coordination

C. Danescu-Niculescu-Mizil, L. Lee, B. Pang and J. Kleinberg (2012). Echoes of power: Language effects and power differences in social interaction, *Proceedings of WWW*.

#### How things are said as opposed to what is said

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Editor_a: Corrected. Please check. Any more outstanding problems? Editor_b: Everything is fine. Thanks a lot.
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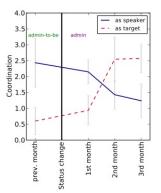
Coordination of b towards a for a class of function words m, for all pairs of utterances  $(u_a, u_b)$  where b directly replies to a:

$$C^m(b, a) = P(u_b \text{ uses } m \mid u_a \text{ used } m) - P(u_b \text{ uses } m)$$

## Coordination and status-based power

Status-based power: Wikipedia editors coordinate more towards admins (Danescu-Niculescu-Mizil et al., 2012. Echoes of Power.) website

Status change has an effect on the level of linguistic style coordination:



Coordination of the user (as speaker) and, respectively, towards the user (as target) in the months before and after status change occurs.

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# **Power-Driven Style Coordination**

Status-based power: Wikipedia editors coordinate more towards admins (Danescu-Niculescu-Mizil et al., 2012. Echoes of Power.)

What about other more implicit forms of social power, such as how 'central' you are within the social network – do they impact linguistic style matching?

B. Noble and R. Fernández (2015). Centre Stage: How Social Network Position Shapes Linguistic Coordination. Workshop on Cognitive Modeling and Computational Linguistics, NAACL 2015.



## The Wikipedia Social Network

We want to construct a *social network* that reflects the *linguistic interactions* between the Wikipedia editors:

- nodes represent individuals in a community Wikipedia editors
- edges give some measure of social connectivity between individuals
   weighted according to the number of direct replies

Corpus: 342,800 posts, 26,397 editors (1,825 of whom are admins)

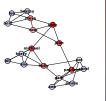


# **Centrality Measures**

# Betweenness centrality: How important are you to community connectivity?

$$\mathrm{BC}(n^*) = \sum_{n \neq m \in N} \frac{|\{\sigma \in \mathrm{Path}(m,n) \mid n^* \in \sigma\}|}{|\operatorname{Path}(m,n)|}$$

where Path(m, n) is the set of shortest paths between m and n

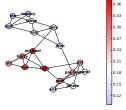




# *Eigenvector centrality*: How important are your neighbours?

$$EC(n^*) = \frac{1}{\lambda} \sum_{n \in M(n^*)} EC(n)$$

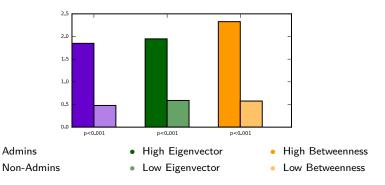
where M(n) is the neighbourhood of n and  $\lambda$  is the largest  $\emph{eigenvalue}$ 



Highly central editors: over one standard deviation above mean score.

#### Results

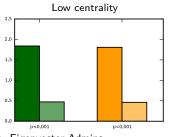
- More style coordination towards administrators.
- More style coordination towards editors in central social positions.



 On average, admins occupy more central positions, but the impact of adminship and centrality turn out to be largely independent . . .

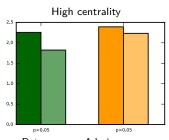
#### Results

- Low-centrality editors receive more coordination if they are admins.
- But adminship is less important for high-centrality users.









- Betweenness Admins
- Betweenness Non-Admins

*social network centrality* sometimes eclipses status-based power in triggering linguistic style adaptation.

## Open Issues ...

Is adaptation to central users (rather than admins) more important for *social acceptance*?

- how does this happen even though centrality is more *implicit*?
- do highly central users exhibit speech more typical of the community?

Several practical applications within computational social science:

- automatic discovery of social relations,
- tracking evolution of relations over time, . . .

Reitter & Moore (2014), Alignment and task success in spoken dialogue, *Journal of Memory and Language*.

→ Shorter older version: Reitter & Moore (2007). Predicting Success in Dialogue, ACL.

- - 1. What does the paper investigate? what is the theoretical motivation? what hypotheses are considered?
  - 2. Which data is used? how is task success determined?
  - 3. What kind of linguistic alignment is investigated?
  - 4. Which experiments are performed? how is alignment/priming measured in these experiments?
  - 5. What are the results? what are their implications according to the authors?

### Research projects

Submit a project proposal by Thursday 13 October at 14:00.

[Between 250 and 500 words, PDF or plain text, sent to raquel by email]

- Who: team members (ideally two).
- What: which phenomenon do you want to investigate, what is your research question?
- Why: provide some motivation, why is this interesting? do you have specific hypotheses?
- How: very important part!
  - which data and methods will you use?
  - which steps do you foresee? is this feasible given the time constraints? make a plan.

We will discuss the proposals on Fri 14 Oct.

### Research projects

Some dialogue corpora freely available or available at ILLC:

- Switchboard
- British National Corpus (BNC)
- Corpus gesproken Nederlands
- Wikipedia talkpage corpus
- Film corpus
- Internet Argument Corpus
- PentoRef (push-to-talk vs free turn taking)
- CHILDES