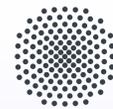


# Diachronic Usage Relatedness (DURel): A Framework for the Annotation of Lexical Semantic Change

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## Introduction

- major obstacle in the computational modeling of semantic change is evaluation
- no reliable test set of semantic change for any language
- we counteract this lack of resources by extending a framework of synchronic polysemy annotation to the annotation of **Diachronic Usage Relatedness (DURel)**
- creating the first test set of lexical semantic change for German

## Related Work

- Blank (1997) develops criteria to distinguish the relatedness of use pairs in the context of lexical semantic change
- various graded polysemy annotation studies of use pairs on relatedness (or similar) scales (Brown, 2008; Erk, McCarthy, & Gaylord, 2013; Soares da Silva, 1992)

## Annotation Scale

- 4: Identical  
3: Closely Related  
2: Distantly Related  
1: Unrelated
- 0: Cannot decide

**Table 1:** Our 4-point scale of relatedness derived from Brown (2008).

## References

- Blank, A. (1997). *Prinzipien des lexikalischen Bedeutungswandels am Beispiel der romanischen Sprachen*. Tübingen: Niemeyer.
- Brown, S. W. (2008). Choosing sense distinctions for WSD: Psycholinguistic evidence. In *Proceedings of the 46th Annual Meeting of the Association for Computational Linguistics on Human Language Technologies: Short Papers* (pp. 249–252). Stroudsburg, PA, USA.
- Erk, K., McCarthy, D., & Gaylord, N. (2013). Measuring word meaning in context. *Computational Linguistics*, 39(3), 511–554.
- Soares da Silva, A. (1992). Homonímia e polissemia: Análise sémica e teoria do campoléxico. In *Actas do xix congresso internacional de lingüística e filología románicas* (Vol. 2, pp. 257–287). La Coruña: Fundación Pedro Barrié de la Maza.

## Lexical Semantic Change

Blank (1997) distinguishes two main types of lexical semantic change:

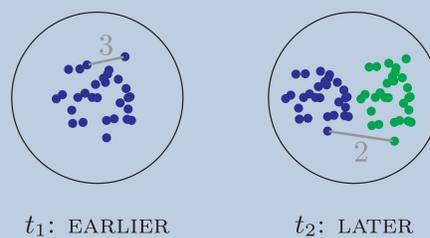
- innovative meaning change:** emergence of a full-fledged additional meaning of a word; old and new meaning are related by polysemy
- reductive meaning change:** loss of a full-fledged meaning of a word

### Example of Innovative Meaning Change

EARLIER  
(1) *An schrecklichen Donnerwettern und heftigen Regengüssen fehlt es hier auch nicht.*  
‘There is no lack of horrible thunderstorms and heavy rainstorms.’

LATER  
(2) a. *Oder es überschauerte ihn wie ein Donnerwetter mit Platzregen.*  
‘Or he was doused like a thunderstorm with a heavy shower.’  
b. *Potz Donnerwetter!*  
‘Man alive!’

## Diachronic Semantic Relatedness



**Figure 4:** 2-dimensional use spaces in two time periods with a target word  $w$  undergoing innovative meaning change. Dots represent uses of  $w$ . Spatial proximity of two uses means high relatedness.

- basic idea:** we measure the mean semantic relatedness of use pairs of a word  $w$  over time  
 $\Delta_{\text{LATER}}(w) = \text{Mean}_{\text{ltr.}}(w) - \text{Mean}_{\text{erl.}}(w)$   
**increase vs. decrease** indicate reductive vs. innovative meaning change
- to capture complex constellations we compare uses from EARLIER and LATER directly:  
 $\text{COMPARE}(w) = \text{Mean}_{\text{cmp.}}(w)$   
**high vs. low** values indicate weak vs. strong change

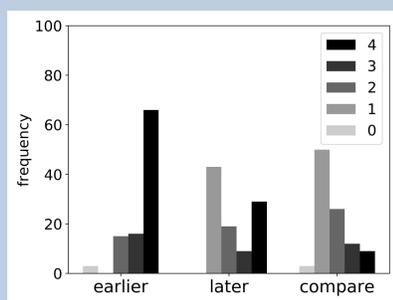
## Annotation Study

- five annotators** rated 1,320 German use pairs on relatedness scale in Table 1
- for **22 target words** we randomly sampled 20 use pairs per group from DTA corpus
- there are **three groups:** EARLIER (1750-1800), LATER (1850-1900) and COMPARE
- order within pairs was randomized, pairs from all groups were mixed and randomly ordered

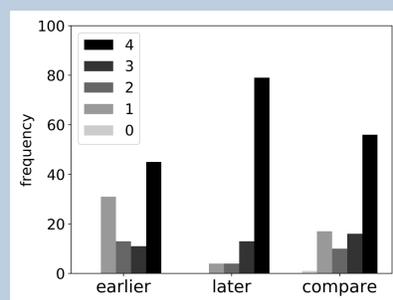
	1	2	3	4	5
1		0.59	0.63	0.67	0.66
2			0.57	0.64	0.65
3				0.64	0.62
4					0.68
<i>avg</i>	0.71	0.68	0.68	0.75	0.74

**Table 2:** Correlation matrix for pairwise correlation agreement of annotators

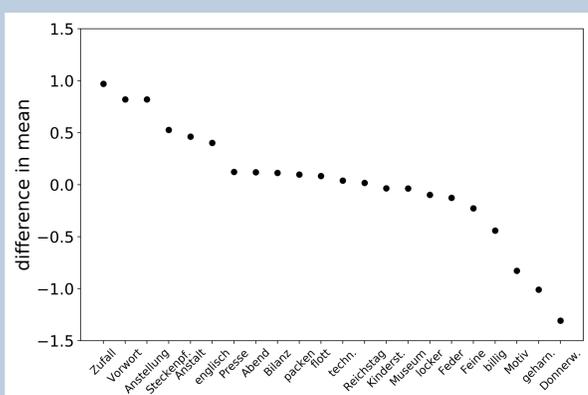
## Results



**Figure 1:** Judg. freq. for *Donnerwetter* (innovative).



**Figure 2:** Judgment freq. for *Zufall* (reductive).



**Figure 3:**  $\Delta_{\text{LATER}}$ : Rank of target words.

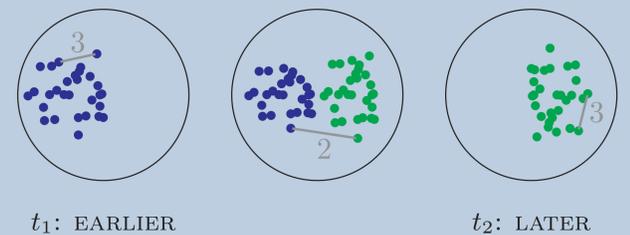
### $\Delta_{\text{LATER}}$ :

- three lowermost words are innovative, three topmost words are reductive meaning changes
- mean value for reduction is 0.39, while it is -0.18 for innovation
- overall distinguishes well between innovation and reduction
- should be used only for **simple constellations**

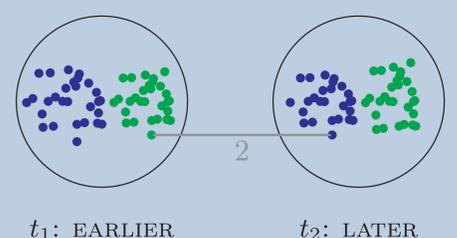
### COMPARE:

- does not distinguish between innovation and reduction (low values can be both)
- should be used only for **monosemous words**

## Discussion



**Figure 5:** Innovative followed by reductive meaning change.  $\Delta_{\text{LATER}}$  predicts no change, while COMPARE predicts change.



**Figure 6:** Polysemous semantically stable word.  $\Delta_{\text{LATER}}$  predicts no change, while COMPARE predicts change.

### Preliminary solution:

$$\Delta_{\text{COMPARE}}(w) = \text{Mean}_{\text{cmp.}}(w) - \text{Mean}_{\text{erl.}}(w)$$