

# Verb polysemy and frequency effects in thematic fit modeling

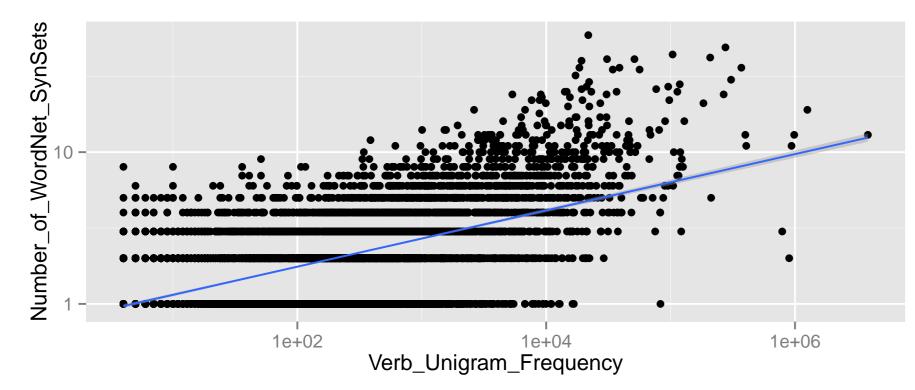


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#### Introduction

Human judgements of *thematic fit* (e.g. how plausible { "croquet", "soccer", "harpsichord", "cheese" } are as patients of "play") are likely sensitive to:

# 1) verb polysemy



## 2) sense frequency

play\_1: participate in games or sport. "We played hockey all afternoon." play\_7: perform music on (a musical instrument). "He plays the flute."

Hypothesis: high polysemy  $\rightarrow$  low thematic fit. Avoid confound: the most polysemous verbs are the most frequent. WordNet orders SynSets based on their frequencies. Hypothesis: more frequent senses get higher scores.

# 3) role-filler (noun) frequency



Soccer is most frequent, croquet is declining, and harpsichord is oldest. Hypothesis: does not affect thematic fit.

#### Project goal:

Obtain human judgements of thematic fit that characterize the effects of verb polysemy, sense frequency, & role-filler frequency.

#### **Stimuli selection**

- McRae et al. (1997) and others obtained human judgements on a scale from 1 (lowest fit) to 7 (highest fit).
- Their question: How common is it for croquet to be played? Our question: Croquet is something that is played. Agree?

#### Verb selection

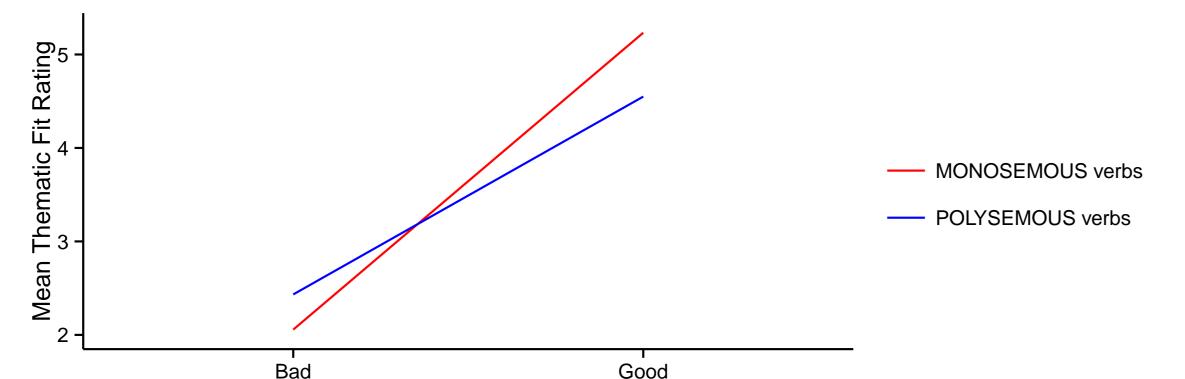
MONOSEMOUS: frequent in COCA, 1 SynSet in WordNet POLYSEMOUS: matched for COCA freq., many SynSets

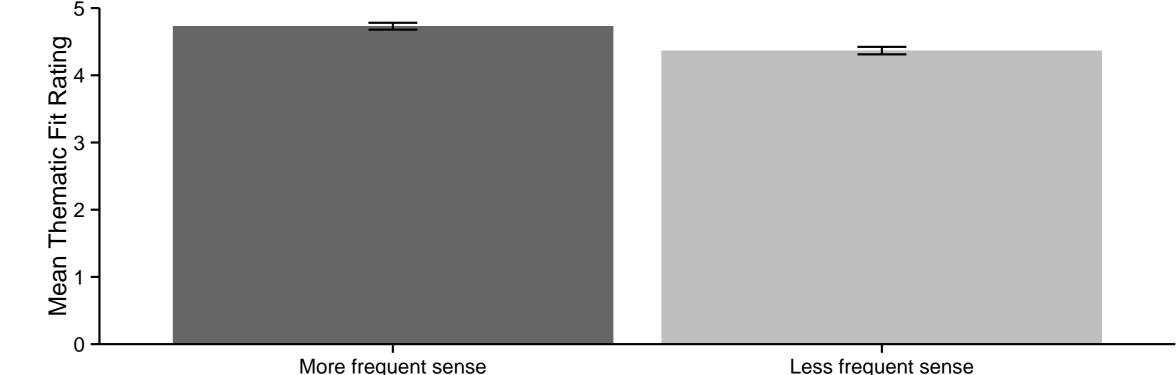
#### **Role-filler type Frequency** whip punish criminal Good for more frequent sense high horse outlaw stallion low Good for less frequent sense high cream (POLYSEMOUS only) frosting low Bad for all senses high baby party (from shuffle of good nouns) gathering fetus low

### Role-filler selection

• To find a good patient-filler, query COCA for: VERB [at\*] [nn\*]. Example: "whip the horse" • Find a much higher or lower frequency synonym. Example: "horse" (32384)  $\rightarrow$  "stallion" (818) Solve For POLYSEMOUS verbs, repeat 1 and 2 for second sense. Example: "whip"  $\rightarrow$  "cream" (19727)  $\rightarrow$  "frosting" (905)

#### Analysis of human judgements





For POLYSEMOUS verbs, bad patient-fillers were not as bad and Participants rated good patient-fillers for the more frequent good patient-fillers were not as good (\*\*\*). sense higher than those for the less frequent sense (\*\*\*).

Noun frequency had a small effect on ratings of good patient-fillers (\*\*), but not on ratings of bad patient-fillers (). Noun frequency affected ratings on POLYSEMOUS verbs (.) less than ratings on MONOSEMOUS verbs (\*\*\*).

Modeling results

#### Conclusions

	Polysemous	Monosemous	FILLERS	All
Centroid	0.405	0.655	0.313	0.464
OneBest	0.447	0.641	0.223	0.452
kClusters	0.432	0.669	0.304	0.479

Spearman's  $\rho$  between human judgements and Greenberg, Sayeed, & Demberg (NAACL, 2015) estimates. These confirm that using multiple prototypes (*OneBest*, *kClusters*) is more helpful for POLYSEMOUS verbs than MONOSEMOUS verbs, and that clustering (*kClusters*) is best for mixed datasets.

Saarland University M<sup>2</sup>CI Cluster of Excellence ► We generated the first dataset of thematic fit judgements that systematically manipulates verb polysemy and role-filler frequency, avoiding confounds with verb unigram frequency. Modeling results show: multiple prototypes per verb-role help with polysemy, but sense frequency should still be addressed. These effects help characterize the nature of linguistic and conceptual material activated by verbs and their arguments. See details in our paper in the CMCL 2015 proceedings: http://aclweb.org/anthology/W/W15/W15-1106.pdf Distributional Memory models and datasets are available at: http://rollen.mmci.uni-saarland.de

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