# Is vagueness rational?

**Presentation of Bachelor-Thesis** 

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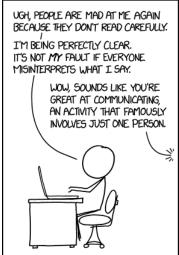
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#### **Misinterpretation**



(https://xkcd.com/1984/)

#### **Problem Statement**

- Why is language vague?
- Which processes enable us to understand vague adjectives like tall?
- What is the exact semantics of such vague terms?
- Is vagueness rational?

#### **Contents**

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### **Pragmatics and Game Theory**

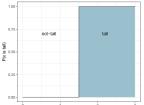
- Pragmatics is a subfield of linguistics.
- (Evolutionary) Game theory analyzes strategic interaction between individuals/agents.
- An evolutionary stable strategy cannot be further improved by other strategies in a population.

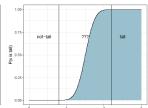
## Adjectival vagueness in language use

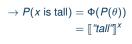
Characteristics of vague adjectives:

- Existence of borderline cases.
- Threshold semantics.

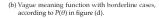
# Schematic presentation of crisp and vague denotations

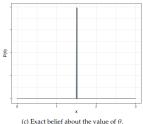


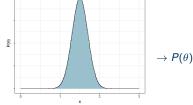




(a) Crisp meaning function, according to  $P(\theta)$  in figure (c).







(d) Uncertainty about the exact value of  $\theta$ .

#### **RSA - Model**

- The rational speech acts model (RSA model) is a cognitive model of language-understanding and -production.
- Bayes' theorem:  $P(A \mid B) \propto P(B \mid A) \cdot P(A)$ .
- An informative speaker chooses utterances, depending on their informativity for a hypothetical literal listener.
- A pragmatic listener infers world states (given a message) by reasoning about the speaker model and taking into account alternative messages.

#### Extension to RSA by Bergen & Goodman (2012)

Agents are defined by **types**, that represent the semantic understanding:

Literal listener:

$$P_{L0}(w \mid m, [\mu, \sigma, \alpha]) = \llbracket m \rrbracket^{w,\mu,\sigma} \cdot Pr(w)$$

Informative speaker:

$$P_{S1}(m \mid w, [\mu, \sigma, \alpha]) \propto exp(\alpha \cdot log(P_{L0}(w \mid m, [\mu, \sigma, \alpha])))$$

Pragmatic listener:

$$P_{L_1}(w \mid m, [\mu, \sigma, \alpha]) \propto P_{S_1}(m \mid w, [\mu, \sigma, \alpha]) \cdot Pr(w)$$
:

With: w = world state (e.g. height), m = message.

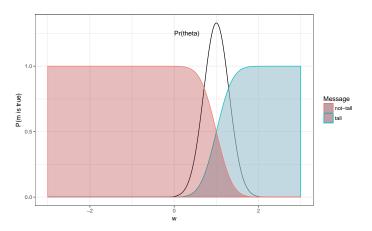
Pr = Prior.

 $\mu, \sigma =$  Threshold parameters,

 $\alpha =$  "Rationality" parameter

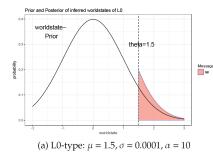
### Implementation of vagueness

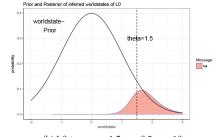
Literal vague meaning of tall and not-tall:



#### **Literal listener** $L_0$ - **Posterior**

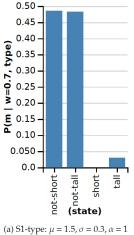
$$P_{L0}(w \mid m, [\mu, \sigma, \alpha]) = \llbracket m \rrbracket^{w,\mu,\sigma} \cdot Pr(w)$$
:

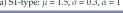


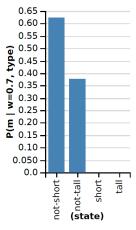


### Informative speaker $S_1$ - Posterior

$$P_{S1}(m \mid w, [\mu, \sigma, \alpha]) \propto exp(\alpha \cdot log(P_{L0}(w \mid m, [\mu, \sigma, \alpha])))$$
:





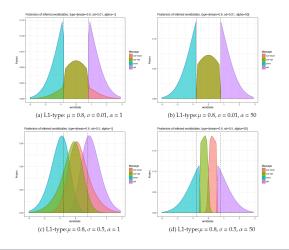


(b) S1-type:  $\mu = 1.5$ ,  $\sigma = 0.3$ ,  $\alpha = 100$ 

Simulation

### Pragmatic listener $L_1$ - Posterior

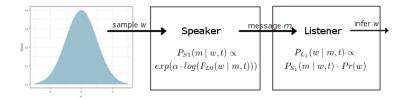
$$P_{L_1}(w \mid m, [\mu, \sigma, \alpha]) \propto P_{S_1}(m \mid w, [\mu, \sigma, \alpha]) \cdot Pr(w)$$
:



Simulation

#### Goal of simulation

- · Agents behave according to RSA.
- Examine effect of different semantic beliefs.
- Find out best strategy.



**RSA - Model** 

### Measure of communicative success: Expected Utility

The **Expected Utility (EU)** is calculated as followed:

$$EU(t_{1}, t_{2}) = \sum_{w} \sum_{m} 0.5 \cdot \left[ P_{S_{1}}(m \mid w, t_{1}) \cdot P_{L_{1}}(w \mid m, t_{2}) \cdot Pr(w) + P_{S_{1}}(m \mid w, t_{2}) \cdot P_{L_{1}}(w \mid m, t_{1}) \cdot Pr(w) \right]$$

#### Simulation set-up

In the simulation, the types are combined from the following parameter spaces:

$$\mu \sim \{0, 0.1, 0.2, ..., 1.9\}$$

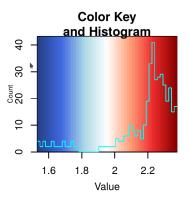
$$\sigma \sim \{0.001, 0.1, 0.2, ..., 1.9\}$$

$$\alpha \sim \{1, 5, 10, 50, 100\}$$

$$M = \{short, not - short, tall, not - tall\}$$

#### Simulation Results / EU data

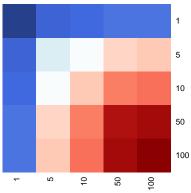
The **Expected Utility** values are displayed in a **heatmap** visualization. Color-key-mapping:



Simulation

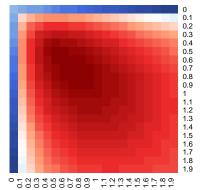
# Effect of parameter $\alpha$





# Effect of parameter $\mu$

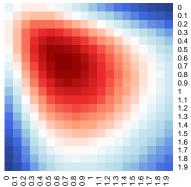




Simulation

### Effect of parameter $\sigma$



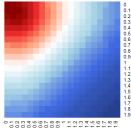


Pragmatics and Game Theory

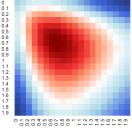
RSA - Model

Discussion

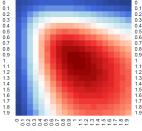
### Interaction effect of parameters $\alpha$ and $\sigma$



(a) Effect of  $\sigma$  on EU-scores with  $\alpha = 1$ .



(b) Effect of  $\sigma$  on EU-scores with  $\alpha = 10$ .



(c) Effect of  $\sigma$  on EU-scores with  $\alpha = 50$ .

### **Evolutionary stable strategies**

With S = set of possible strategies. Strategy  $s_i$  is an ESS, if for all  $s_j \neq s_i \in S$ :

$$1.EU(s_i, s_i) \ge EU(s_j, s_i)$$
 and  $2.EU(s_i, s_j) > EU(s_j, s_j)$ 

The only ESS is:

$$\mathit{type_{opt}} = \left[\mu = 0.8, \sigma = 0.5, \alpha = 100\right]$$

#### **Discussion and Conclusion**

- Pragmatic recursive reasoning allows for interpretation of vague adjectives.
- Rational agents can make use of vagueness.
- · Vagueness indeed seems to be rational.

Thank you!

