

## Discussion of Rohde et al. (2012) and Degen, Franke & Jäger (2013)

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### Rohde, Seyfarth, Clark, Jaeger & Kaufmann (2012)

- High-level question: What are the predictions regarding which form-meaning mappings interlocutors will converge on?
- Evaluates alignment in a communication game with explicit superimposed costs and rewards for production and comprehension.
- Game-theoretic predictions in linguistic communication:



Figure 1. Various costs in referring expressions

- *What are your predictions regarding the way interlocutors use low-cost ambiguous and high-cost unambiguous referring expressions? How do these predictions relate to implicatures in Grice (1975) and Levinson (2000)?*

- Experiment 1: Communicating about objects with divergent costs
  - 8 referential expressions – 6 unambiguous names that have various costs, and 2 low-cost ambiguous words.

| Name    | Cost | Name         | Cost |
|---------|------|--------------|------|
| “Rose”  | -60  | “Apple Tree” | -60  |
| “Daisy” | -120 | “Palm Tree”  | -120 |
| “Tulip” | -280 | “Pine Tree”  | -250 |
| “Flower | -80  | “Tree”       | -80  |

Table 1. Referring expressions and their costs in Exp. 1

- Sender’s task: send a message to the Receiver; Receiver’s task: guess what object the Sender intended.
- Shared knowledge in the game

Your points: **115** / 1000  
Your partner's points: **-145** / 1000  
Time remaining: **18 min 20 sec**

|            |              |                  |              |
|------------|--------------|------------------|--------------|
| Tulip      | Rose [-60]   | Apple Tree [-60] | Flower [-80] |
| Apple Tree | Daisy [-120] | Palm Tree [-120] | Tree [-80]   |
| Daisy      | Tulip [-280] | Pine Tree [-250] |              |
| Flower     |              |                  |              |

Figure 2. Interactive game environment in Exp.1&2

- Results & Analysis
  - Production (whether the Sender sent an ambiguous word)~**cost** (the target object's unambiguous cost)
  - Comprehension (whether an ambiguous word resulted in successful communication)~**cost** (the target object's unambiguous cost)
  - Interpretation of ambiguous words ~ **trial number**

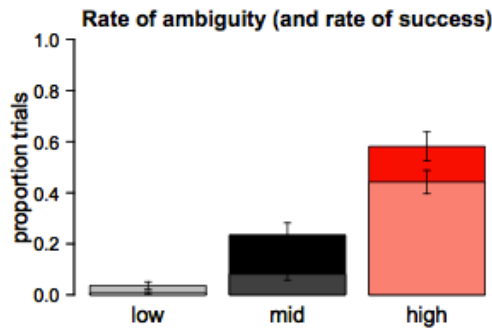


Figure 3. Rate of ambiguity and success

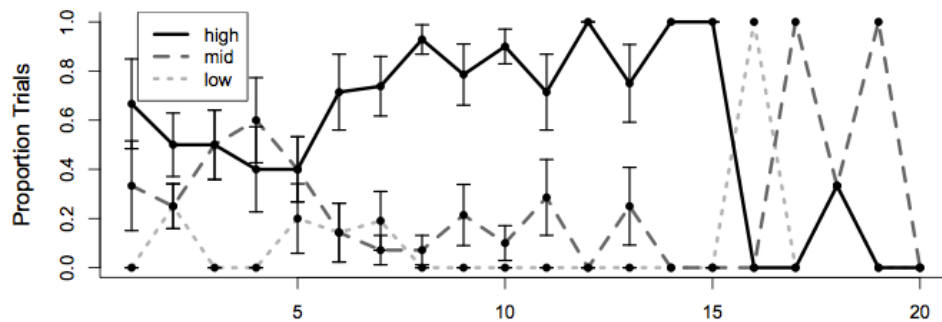


Figure 4. Interpretation of ambiguous words over trials

- Experiment 2: Communicating about object with similar costs
  - Game environment was identical with Experiment 1 except the costs.

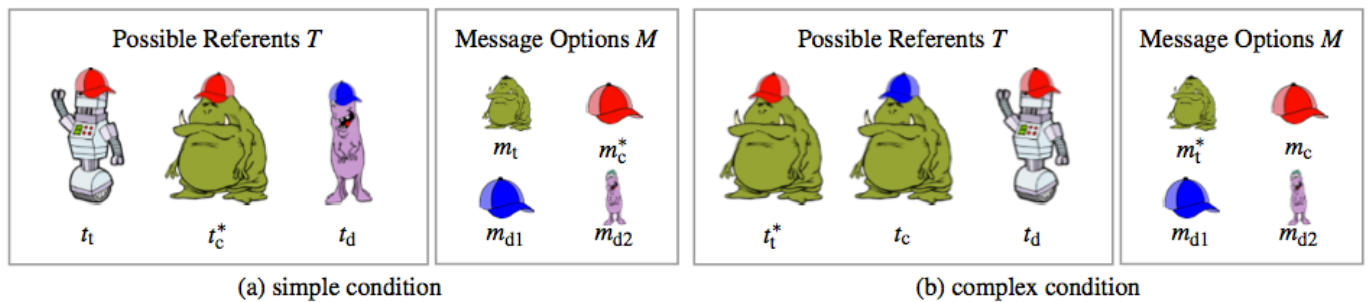
| Name     | Cost | Name         | Cost |
|----------|------|--------------|------|
| “Rose”   | -80  | “Apple Tree” | -80  |
| “Daisy”  | -140 | “Palm Tree”  | -135 |
| “Tulip”  | -165 | “Pine Tree”  | -170 |
| “Flower” | -80  | “Tree”       | -80  |

- Prediction: the revised costs may reduce the likelihood that players would coordinate their use of referring expressions.
- Results: lower costs did not reduce players' motivation to conventionalize.
  - *Why the results are different from the prediction? What are the possible explanations?*
- General discussion
  - Sensitivity to relative costs
    - *How should production cost be measured?*
      - Future work: costs that are imposed naturally in regular conversation

## Degen, Franke & Jäger (2013)

- High-level questions: How much do speakers and listeners take into account each other's perspective? How much influence do economy considerations have; do listeners weigh the speaker's production costs? (p. 376)
- Presents experimental data about production and comprehension of ambiguous referential expressions in an artificial language game
- Proposes a probabilistic model of back-and-forth reasoning that synthesizes Bayesian models and game theoretic approaches

- Referential language games



➤ *What are simple condition and complex condition? How does one draw inference in these conditions?*

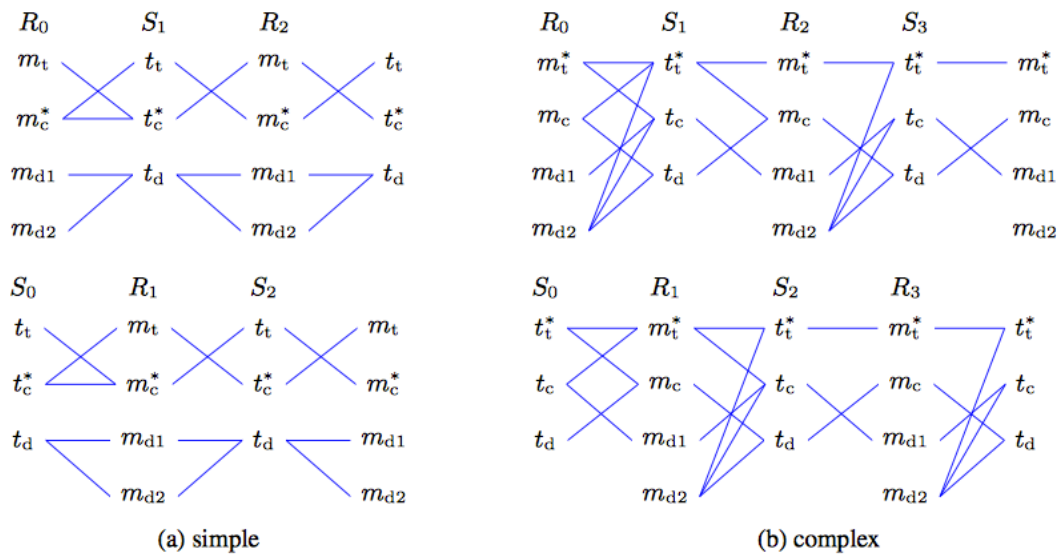
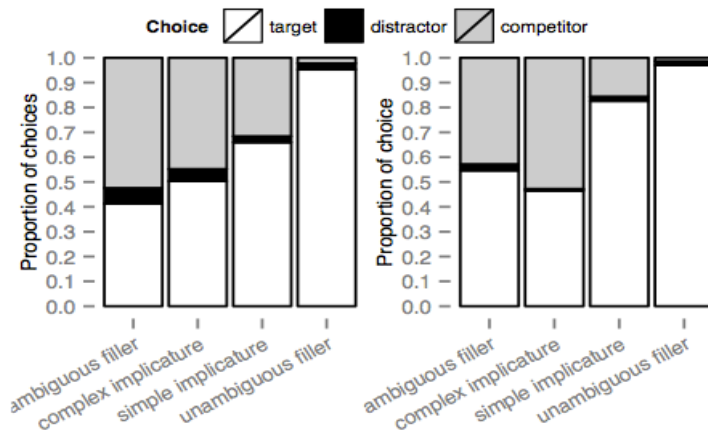
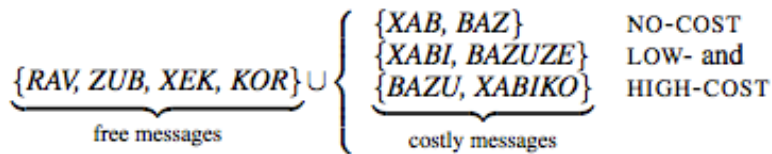


Figure 5. Qualitative predictions of the IBR model for simple and complex conditions.

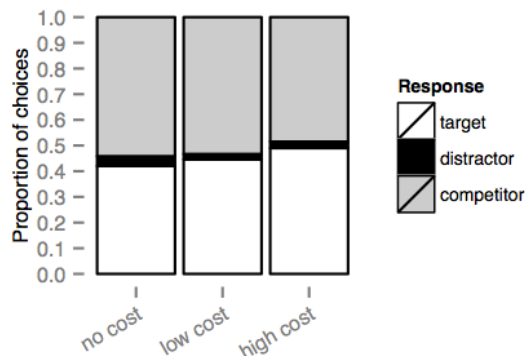
- Experiment 1: Comprehension
  - Language learning stage
  - Inference stage
    - Participants were asked to send one of Zorx words provided in the trial to another participant to get them to pick out the intended object.
  - Results



- Experiment 2: Production
  - Language learning stage and Production stage
    - Procedure same as the production trials in Experiment 1
- Experiment 3: Comprehension with costs
  - Tested whether listeners take into account speakers' preferences for producing minimally effort messages
  - Language learning stage, Cost estimation stage, and Inference stage
  - Three cost conditions: NO-COST, LOW-COST and HIGH-COST



- Results



- The Iterated Quantal Response (IQR) Model

- Signaling games

|   |                   |   |
|---|-------------------|---|
| T | $t_1, \dots, t_a$ | a set of $a$ different states (referents) |
| M | $m_1, \dots, m_b$ | A set of $b$ relevant expressions         |
| B | $(a, b)$          | Boolean matrix                            |
| C | $c_1, \dots, c_b$ | a vector of costs                         |

- Strategies

- Sender strategy  $\sigma$

- Receiver strategy  $\rho$
  - Expected Utilities
    - Sender's expected utilities:  $EU(\rho) = T(\rho) - c$
    - Receiver's expected utilities:  $EU(\sigma) = \mu(\sigma)$
  - Best Responses
    - $BR(U) = N(\max \text{row}(U))$  ( $U$  is an expected utility matrix)
  - Quantal Responses
    - $QR_\lambda(U_{ij}) \propto \exp(\lambda U_{ij})$  ( $\lambda$  is a rationality parameter)
  - IQR
    - Defines a hierarchy of player types
    - Level-0 Sender and Receiver try to implement the literal meaning:  $\sigma_0 = QR_\lambda(B - c)$ ;  $\rho_0 = QR_\lambda(T(B)I_a)$
    - Level ( $k + 1$ ) player behavior is defined as a quantal response to a belief that the other player is at most of level  $k$ .  
 $\sigma_{k+1} = QR_\lambda(EU(\rho \leq k))$   
 $\rho_{k+1} = QR_\lambda(EU(\sigma \leq k))$
  - Model fitting
    - Two free parameters:  $\lambda, \tau$
- *Compare this model with the model of Frank and Goodman (2012) and the Iterated Best Response (IBR) model of Jäger (2012), what are the differences?*

### References:

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