# Dissertation in Language Sciences

### s1107496

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#### Abstract

Particle swarm optimization (PSO) has been proposed as a means of modeling changes in human behaviour in a social context. PSO has also been shown to be an effective optimization method for non-differentiable problems with continuous search spaces, and has seen widespread use as such. In this report, the language game presented in Rohde et al.'s "Communicating with Cost-based Implicature: a Game-Theoretic Approach to Ambiguity" is modeled as a particle swarm optimization task, with the aim of creating a system which captures the results seen in Rodhe et al.'s experiments. Further to this, PSO's suitability for use in language games with dynamic fitness functions and how we might frame PSO's behaviour from game-theoretic and psycholinguistic standpoints are also discussed.

## 1 Introduction

In "Communicating with Cost-based Implicature: a Game-Theoretic Approach to Ambiguity" (2012), Rohde et al. present an iterated language game in which participants aim to indicate an object to their partner via use of one of several possible referring terms. Participants gain points upon successful communication, but must spend points in order to communicate. Each referent has a corresponding unambiguous form that players may choose to send to their partners, alternatively, players may send an ambiguous form with a different cost that could potentially indicate a number of referents. The studies run by Rohde et al. demonstrated the likelihood of a pair of participants to successfully coordinate their use of an ambiguous reference to be partially contingent on the relative costs of the unambiguous and ambiguous references.

Particle swarm optimization, as originally introduced by Kennedy and Eberhart (1995), can serve not only as a general optimization method, but also as a means of modeling human social behaviour, especially in the context of collaborative problem solving (Kennedy 1997). Modeling the language games used in Rohde et al. as particle swarm optimization tasks, if possible, would allow a more exhaustive exploration of the effects of various form costs on reference coordination, offering a comprehensive picture of the circumstances under which ambiguous form entrainment is possible and likely. Further to this, an accurate particle-swarm-based model of human coordination in a discourse setting might shed light on more fundamental aspects of human cognition and social interaction as represented via the model's

parameters. A successful model could also suggest particle swarm optimization's suitability for the modeling of other linguistic phenomena.

Conversely, if particle swarm optimization is not a viable means of modeling the results observed in Rohde et al., this could suggest a fundamental difference between human linguistic behaviours and other social behaviours as successfully modeled via PSO. A negative finding might also suggest that specialized models, such as Liu et al.'s "human behaviour-based particle swarm optimization" (2014), are required for the modeling of more complex human social interactions.

To address these possibilities, this report models Rohde et al.'s experiments as a particle swarm optimization task, utilizing a mixed strategy search space to represent form production and comprehension.

# 2 Background

## 2.1 Particle swarm optimization

### 2.1.1 Origin

#### 2.1.2 Previous work

- Noto et al. (2013) "Agent-based Social Simulation Model for Analyzing Human Behaviors using Particle Swarm Optimization" ("Agent-based Social Simulation Model for Analyzing Human Behaviors using Particle Swarm Optimization")
- Cheng et al. (2008) "A modified Particle Swarm Optimization-based human behavior modeling for emergency evacuation simulation system"

- 2.1.3 Parameters and equations
- 2.2 Rohde et al. 2012
- 2.2.1 More detailed overview of method
- 2.2.2 More detailed overview of results
- 2.2.3 Game-theoretic model

## 3 Methods

- 3.1 Modeling language game as PSO task
- 3.1.1 Mixed-strategy search space
- 3.1.2 Particles are agents
- 3.1.3 Criteria for "ambiguous coordination" and "unambiguous coordination"
- 3.1.4 Model with particles restricted to search space vs. not
- 3.2 Optimizing parameters for PSO with PSO
- 3.2.1 Evaluating error
- 4 Results
- 4.1 Results of meta-optimization (PSO parameters)
- 4.2 Results for model with search space restriction
- Rates at approximately correct levels, but reacts incorrectly to cost adjustments
- 4.3 Results for model without
- Ratios of rates track well onto data from experiments, but rates much lower
- 5 Discussion
- 6 Conclusion