### GAME-BASED LANGUAGE TUTORING: A CASE STUDY FOR COLOUR

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http://arti.vub.ac.be/~katrien/bcn-game-based-tutoring.pdf

#### OUTLINE

- 1. Language games in artificial agents
  - Definition and use
  - Implementation: conceptualization, grammar and learning
- 2. Language games for tutoring purposes
  - Demonstration and preliminary evaluation

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# LANGUAGE GAME



Father: Could I have

some more water?

Mother: ... hands over

the wine

Father: No, water

please.

Mother: Sparkling?

Father: Yes.

Mother: ... pours him

some water

Father: Thanks.

### LANGUAGE GAME

Robot-1: The yellow

block.

Robot-2: ... points to the

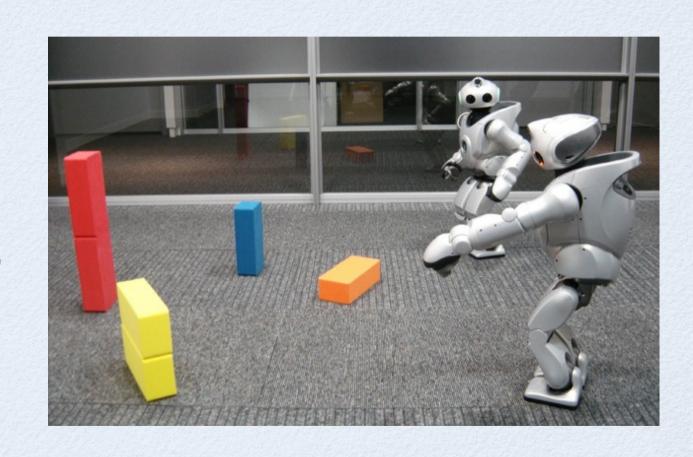
orange block.

Robot-1: No ... points to

the yellow block.

Robot-2: The yellow

block.



#### PROPERTIES

- At least two individuals from a community (recurrent interaction)
- Common goal as part of situated cooperative actions
- Common ground
- Routinised interaction pattern (script)
- Interaction involves symbols but also gestures and actions

## WHY?

- Captures communication as primary function of language
- Allows addressing issues of meaning
- Incorporates issues of context
- Language conventions are game/context dependent, not absolute
- Useful to isolate one specific aspect of language

### SEMIOTIC CYCLE

speaker

grounding

sensory-motor streams

hearer

grounding

conceptualization

production

speech articulation

interpretation

parsing

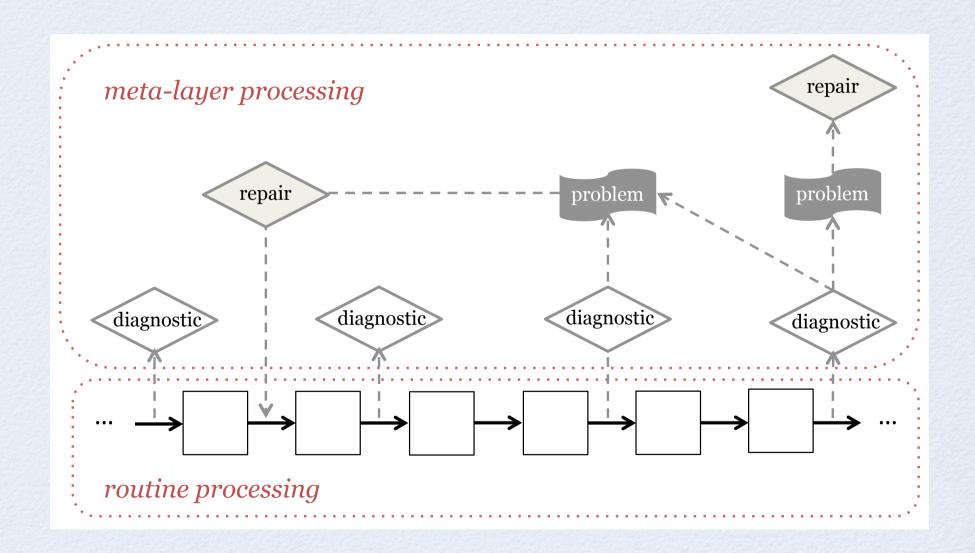
utterance

speech recognition

#### BABEL 2

- Operationalization of processes in semiotic circle
- Connection between our core technologies Fluid Construction Grammar (FCG) and Incremental Recruitment Language (IRL) with mechanisms for:
  - multi-agent interactions
  - robotic embodiment
  - cognitive processing
  - learning
- Extensive monitoring system

## LEARNING



### TUTORING GAMES

- Human = tutor; agent = learner
- Both can be speaker or hearer
- Human can mediate the flow of the game (select topic, give feedback)
- Reversed tutoring roles possible (human as a learner)

### INTERACTION SCRIPT

- 1. Human selects one object in the context
- 2. Human finds distinctive category for the object and names it
- 3. Agent looks up category name in memory and examines context to find corresponding object
- 4. Agent signals intended object
- 5. Human evaluates choice: failure/success

# COLOUR DEMO

Start the game

#### CONCEPTUALIZATION

- RGB colour chip mapped in CIE  $L^*a^*b^*$  space
- One nearest-neighbour classification to find category
- New name => new category [Xu, 2002]

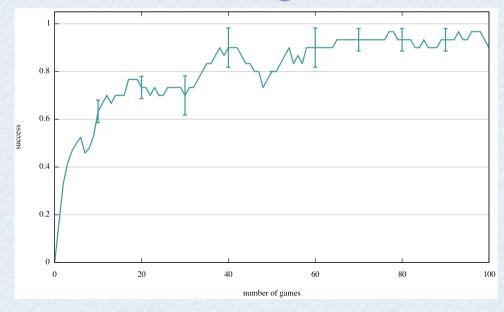
### ALIGNMENT

- Update colour category at the end of each successful interaction
- Shift existing prototype in direction of colour chip values
- Colour alignment rate specifies new location of protoype ( $c_{n+1}$ ) linearly between old location ( $c_n$ ) and topic (t):

$$c_{n+1} = (1 - r_a)c_n + r_a t$$

#### COMMUNICATIVE SUCCESS

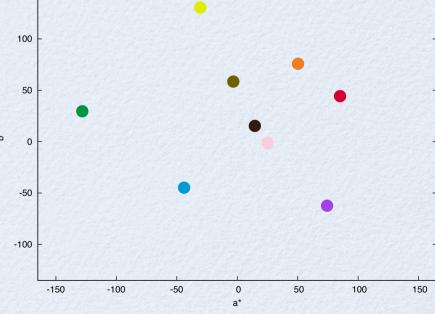
- 1 or 0 at the end of the game; measure averaged over 10 games
- Reaches > 80% after 50 games



## COLOUR PROTOTYPES

- Positions of colour prototypes after 100 games in CIE  $L^*a^*b^*$  space
- Two basic colour terms uncovered: white and grey

German speaking tutor



#### DISCUSSION

- Previous study [Belpaeme and Bleys, 2009] has shown that pre-programmed agents can consistently name 83% of colour chips
- 90% correctly named chips in CTG
- BUT! Human tutor can avoid difficult chips
  => measure reflects similarity in human +
  agent categories

### FUTURE WORK

- Evaluation of the system
- Extension to other domains:
  - Convert existing language game experiments: quantifiers [Pauw and Hilferty 2011], case systems [van Trijp, 2011], spatial language [Spranger et al., 2010]

Simon Pauw and Joseph Hilferty. The Emergence of Quantification. In Luc Steels, editor, *Experiments in Language Evolution*. John Benjamins, Amsterdam, in press.

Remi van Trijp. The Emergence of a Case Grammar. In Luc Steels, editor, *Experiments in Language Evolution*. John Benjamins, Amsterdam, in press. Michael Spranger, Simon Pauw and Martin Loetzsch. Open-ended Semantics co-evolving with Spatial Language. In *Proceedings of EVOLANG 8*, 2010.



# THANK YOU!

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