# Situational Grounding within Multimodal Simulations

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#### **3** Definitions of Simulation

- 1. <u>Computational Simulation Modeling</u>
- Variables are set, model is run, consequences emerge
- e.g., climate change, biological pathways, etc.
- Goal is to arrive at best model using simulation
- 2. Situated Embodied Simulation
- User interacts with virtual or simulated world
- e.g., flight/battle simulator, video games



http://www.voxicon.net http://github.com/VoxML



- Model testing of Computational Simulation Modeling
- Visualized embodiment of Situated Embodied Simulation
- Mode of presentation of **Embodied Theories of** Mind

- Goal is to simulate agent in situation
- **Embodied Theories of Mind**
- Mental representation of agents and their communicative acts
- e.g., future or possible outcomes, interpretations of perceptual input
- Goal is to view semantic interpretation of an expression

## **Reasoning in an Interpreted Simulation**



VoxSim implementation reasons about consequences of actions taken and needed preconditions





### **Formal Interpretation of Simulations**

- Contextualized 3D realization of environment, agents, and salient content of communicative acts, rich semantic typing:
- Object encoding with action affordances
- Action encoding as multimodal programs
- Reveals common ground between parties
- Common ground:



- Co-situatedness, co-perception, co-attention, co-intent
- VoxML (Visual Object Concept Modeling Language)
- voxeme : lexeme :: voxicon : lexicon
- Habitats: situational conditional environment
- Affordances: behavior driven by structure (Gibsonian) or purpose (telic)



Computer interprets multimodal input – without context of environment, interpreting is intractable



Decoupled reasoning about objects and actions

## Learning by Communication



#### **User-constructed staircases**



**CNN-RNN** staircases learned from qualitative relations







Correcting a sample with multimodal embodied communication

## Conclusions

• Deep formal semantics combine with 3D environments to enable "computational embodied cognition"

Object model

- Gaming technologies provide powerful platforms to gather data for deep learning and commonsense reasoning
- Game engines do "heavy lifting" of graphics, physics, UI, etc.
- Enable novel research in



#### simulation-based understanding



