



# PACO-PLUS

## Perception, Action, and Cognition through Learning of Object Action Complexes

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### PACO-PLUS: The Concept

Fundamental assumptions:

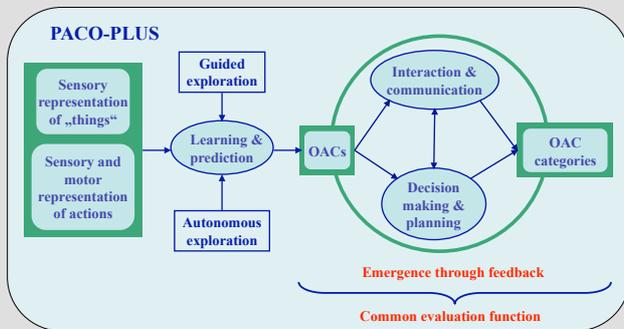
- Objects and Actions are inseparably intertwined in cognitive processing; that is "Object-Action Complexes" (OACs) are the building blocks of cognition.
- Cognition is based on reflective learning, contextualizing and then reinterpreting OACs to learn.
- The core measure of effectiveness for all learned cognitive structures is: Do they increase situation reproducibility and/or reduce situational uncertainty in ways that allow the agent to achieve its goals?

#### Continuous Path to Cognition and Language

- Object-Action Complexes (OACs) through exploration, interaction and learning.
- OACs are categories with *implicit* semantics.
- Sharing of the same OACs  
→ mutually grounded symbols  
→ language
- Shared symbols  
→ *explicit* reasoning and communication

#### Unified Measure of Success and Progress

- Common evaluation function for contingency minimization and return maximization strategies.
- Exploration, imitation, SARSA like learning strategies.
- Decision making and planning  
→ bias the evaluating functions
- Demonstration and evaluation on a humanoid robot.



### Objects, Exploration, and Planning

- A hierarchical architecture allows for a systematic transition of sensory information to higher semantic quality (as well as feedback processes from the higher levels to the lower levels), which generates cognitive processes on all levels.
- Our system is equipped with a well motivated amount of prior knowledge that allows for learning on all three levels of the hierarchy, such as:
  - ✓ On the sensory level, the fine tuning of prewired behaviours (grasping-reflexes, pushing actions);
  - ✓ On the mid-level, the learning of feature combinations with associated grasps and the learning of objects for recognition;
  - ✓ On the planning level, the learning of consequences of actions in abstract state spaces and the generalization of abstract rules to guide the system in further planning operations.
- We have realized grounding processes, which link high level concepts to sensory data.

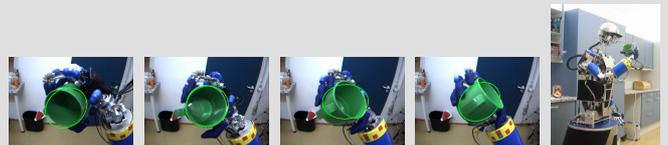
### Test Platform: Humanoid Robot ARMAR

- 7-DOF head with foveated stereo vision, gyro, and 6 microphones;
- 3-DOF torso, two 7-DOF arms;
- Two 5-finger hands, each with 8 DOFs and tactile sensors;
- Holonomous mobile platform;
- A number of sensori-motor processes to autonomously act in unstructured environments (kitchen).



### Actions, Imitation, and Sequencing

- 3-D motion capture for reproducing and interpreting actions of human agents.
- Non-supervised generation of a grammatical representation of actions based on sensorimotor primitives. This grammatical representation will be extended to provide the necessary basis for planning and plan recognition.
- Goal-directed action synthesis using locally-weighted regression. We showed how to connect action synthesis with techniques such as coaching and imitation, which enable us to acquire example action libraries and generalize from them.
- A mechanism to select actions that reduce uncertainty for various directions in the feature space in situations with partial observability.



### Processes for Acquiring OACs

#### Reinforcement learning:

- We developed an original approach how to introduce continuous action space that operates quickly and does not require action space sampling.
- We have started to investigate coaching procedures that are biologically grounded and physically implementable on real robots.

#### Symbolic processes:

- We extended the state of the art PKS planning system to allow representing various kinds of knowledge.
- We are exploring using rapid replanning to deal with uncertainty in the environment rather than probabilistic approaches.