



Introduction to Robotics

Lecture 12

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Technical Aspects of Multimodal Systems

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- Introduction
- Spatial Description and Transformations
- Forward Kinematics
- Robot Description
- Inverse Kinematics for Manipulators
- Instantaneous Kinematics
- Trajectory Generation 1
- Trajectory Generation 2
- Dynamics
- Robot Control
- Path Planning
- Task/Manipulation Planning
- Telerobotics
- Architectures of Sensor-based Intelligent Systems





- The CMAC-Model
- The Subsumption-Architecture
- Control Architecture of a Fish
- Procedural Reasoning System
- Hierarchy
- Architectures for Learning Robots

Summary

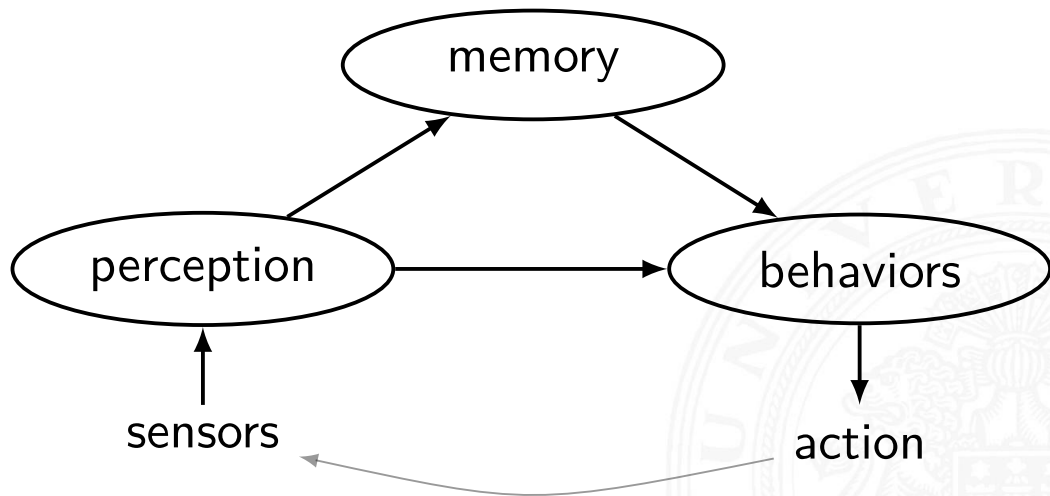
Conclusion and Outlook





Overview

- ▶ Basic behavior
- ▶ Behavior fusion
- ▶ Subsumption
- ▶ Hierarchical architectures
- ▶ Interactive architectures





CMAC: Cerebellar Model Articulation Controller

S sensory input vectors (firing cell patterns)

A association vector (cell pattern combination)

P response output vector ($\mathbf{A} \cdot \mathbf{W}$)

W weight matrix

The CMAC model can be viewed as two mappings:

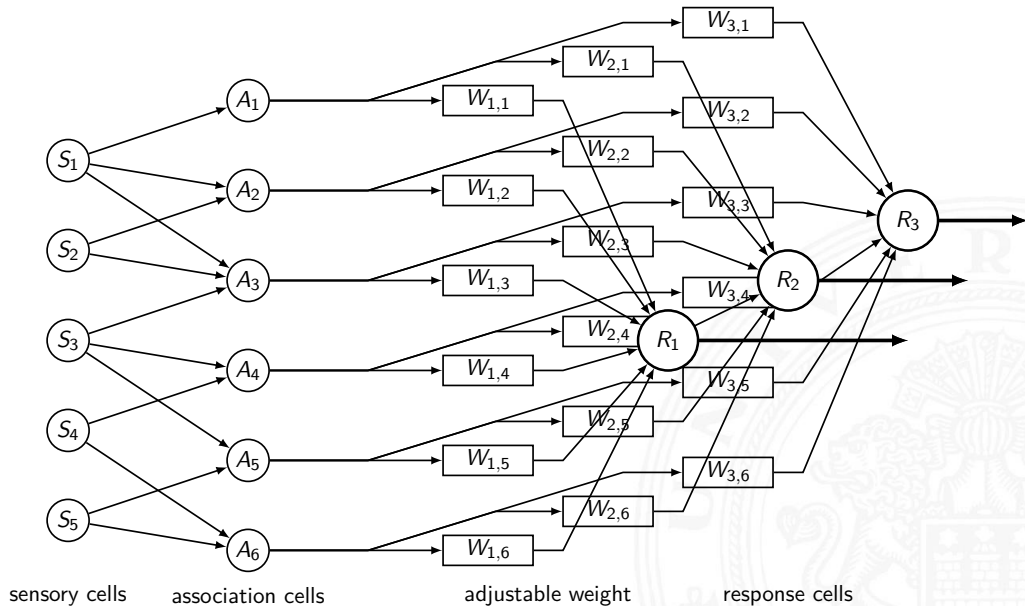
$$f : \mathbf{S} \rightarrow \mathbf{A}$$

$$g : \mathbf{A} \xrightarrow{\mathbf{W}} \mathbf{P}$$

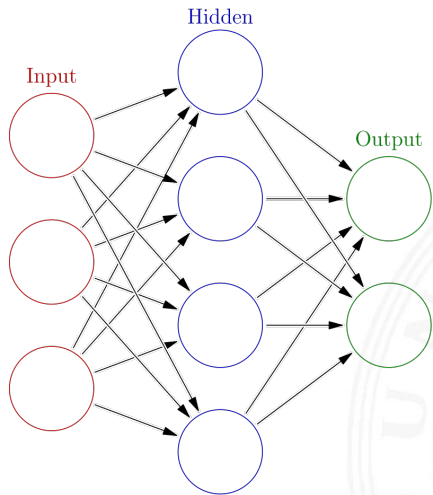




CMAC-Model (cont.)

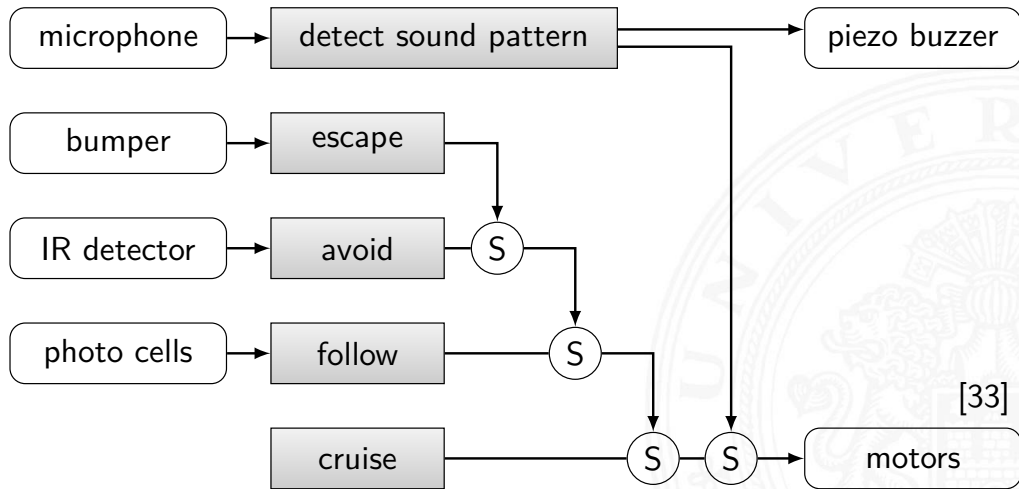


Artificial neural networks (ANN) or connectionist systems are computing systems vaguely inspired by the biological neural networks that constitute animal brains.



The Subsumption Architecture

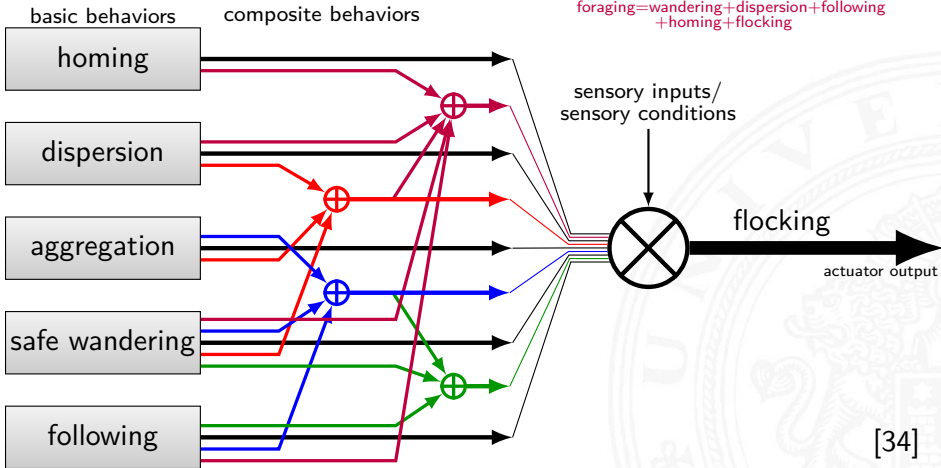
- ▶ hierarchical structure of behavior
- ▶ higher level behaviors subsume lower level behaviors



Foraging and Flocking

- ▶ multi-robot architecture
- ▶ basic behaviors are sequentially executed

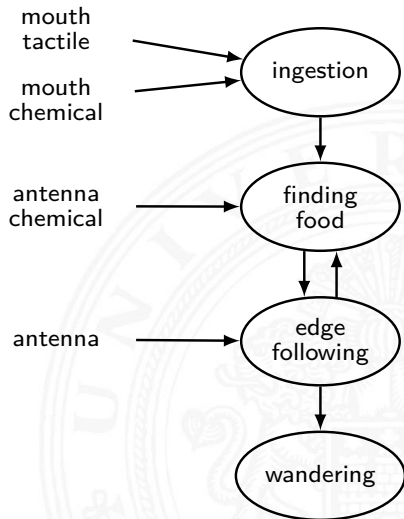
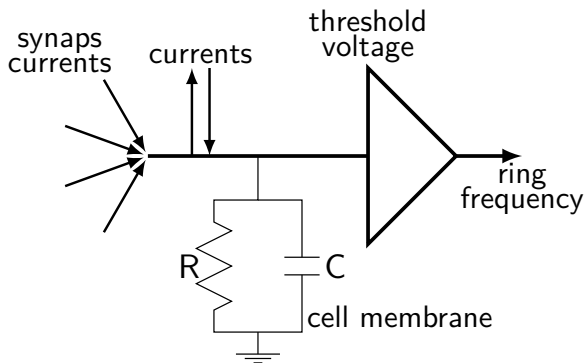
flocking=wandering+aggregation+dispersion
surrounding=wandering+following+aggregation
herding=wandering+surrounding+flocking
foraging=wandering+dispersion+following
+homing+flocking



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SENSORS

BEHAVIORS





Control and information flow in artificial fish

Perception sensors, focuser, filter

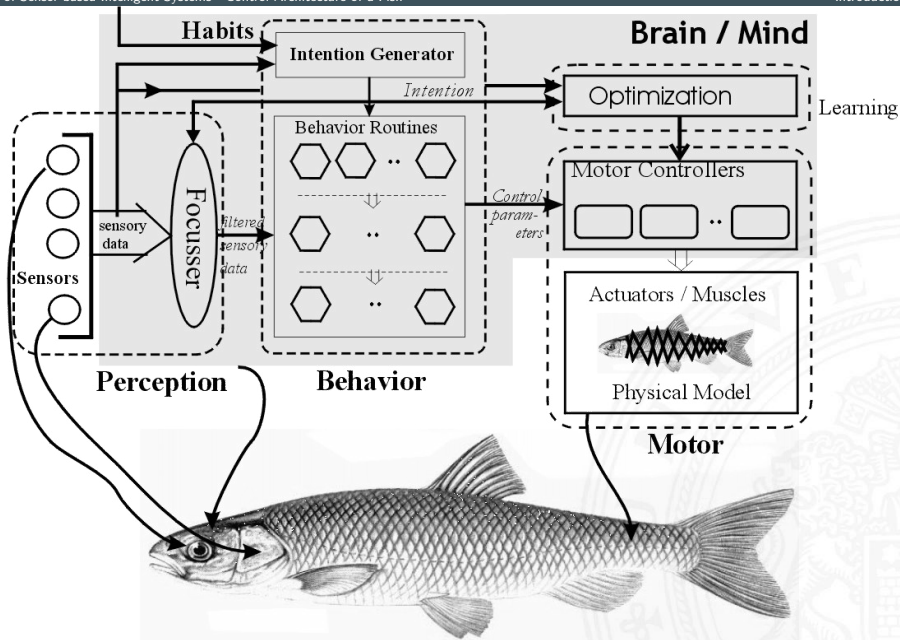
Behaviors behavior routines

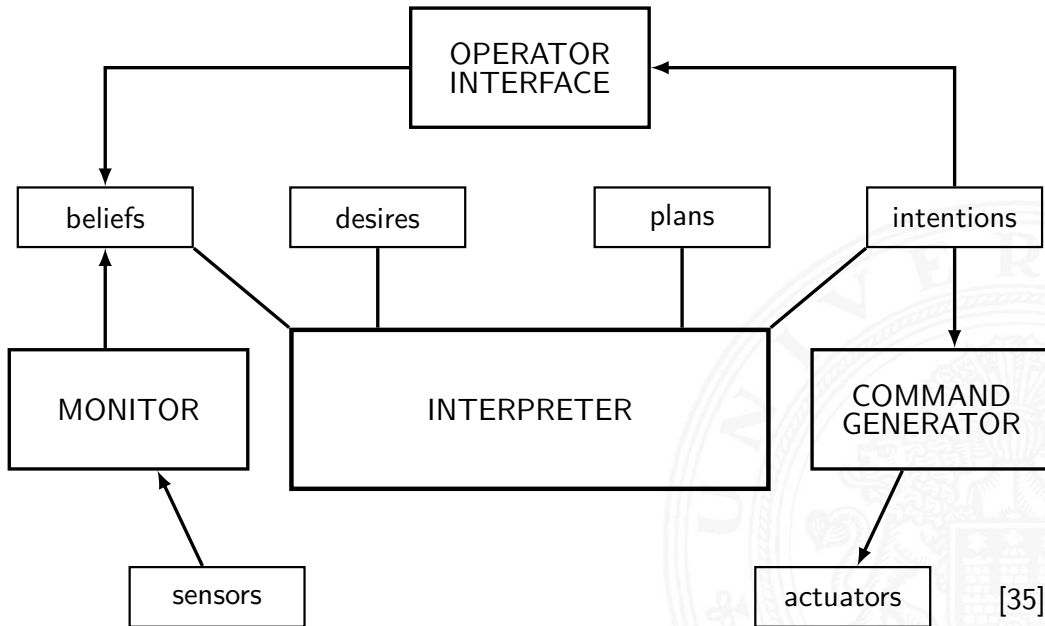
Brain/mind habits, intention generator

Learning optimization

Motor motor controllers, actuators/muscles

Control Architecture of a Fish (cont.)





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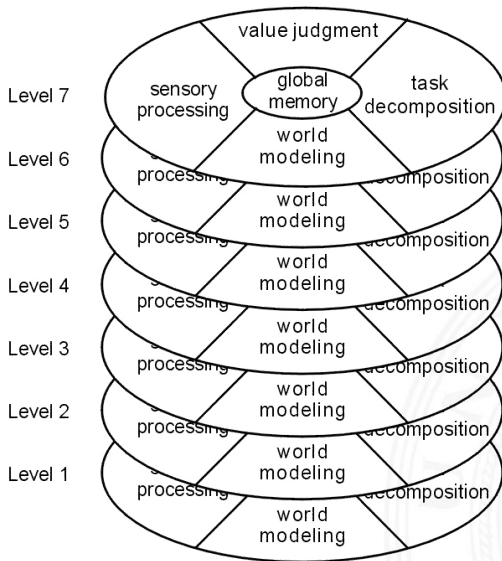
Real-Time Control System (RCS)

- ▶ RCS reference model is an architecture for intelligent systems.
- ▶ Processing modes are organized such that the BG (Behavior Generation) modules form a command tree.
- ▶ Information in the knowledge database is shared between WM (World Model) modules in nodes within the same subtree.

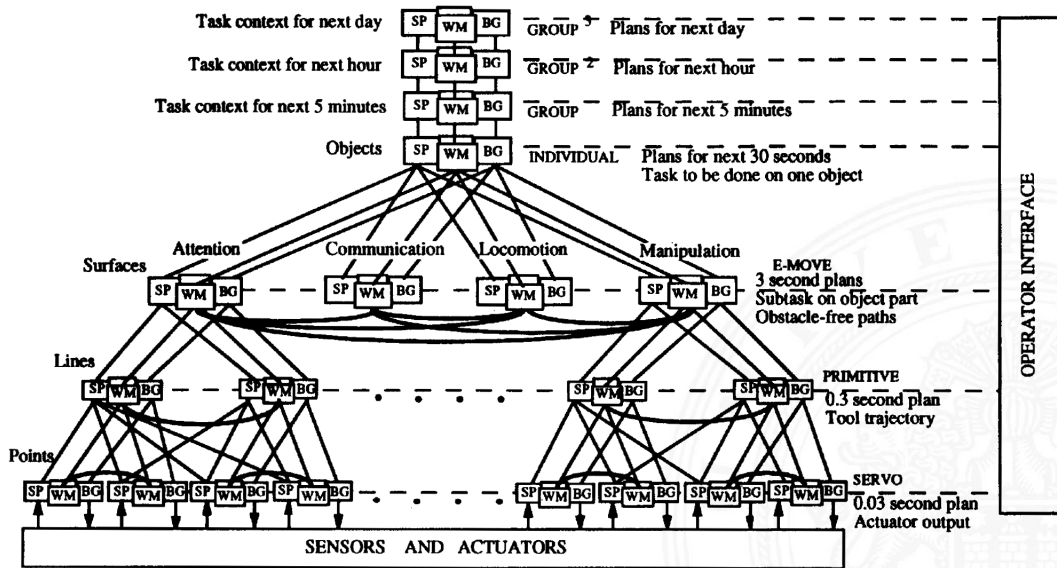
[36]

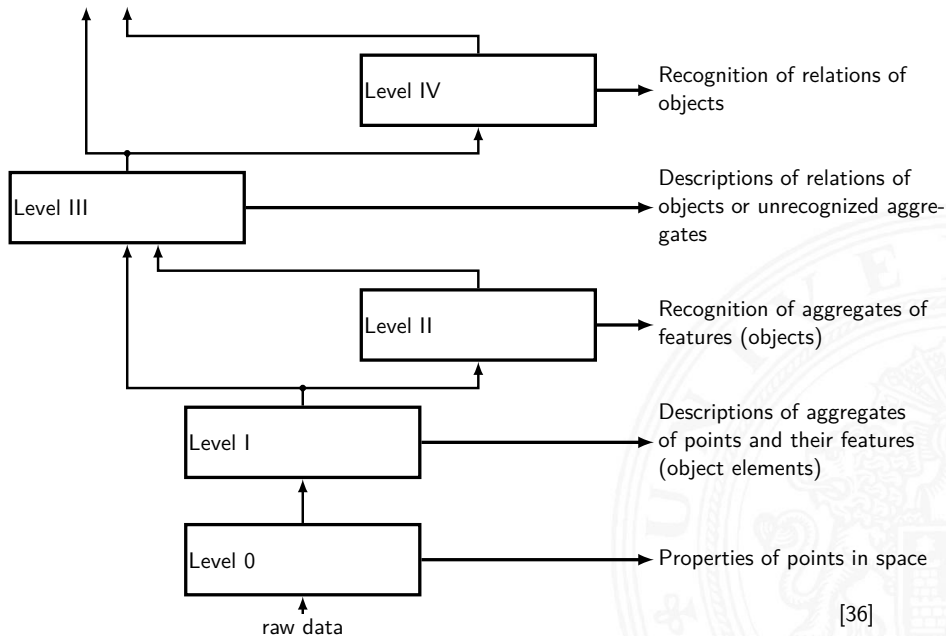
Examples of functional characteristics of the BG and WM modules:

Hierarchy (cont.)



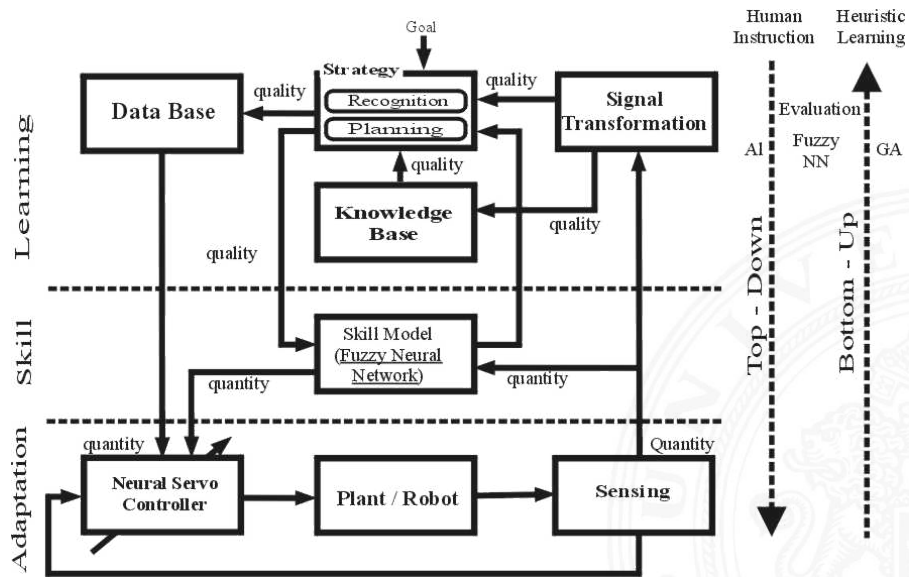
Hierarchy (cont.)





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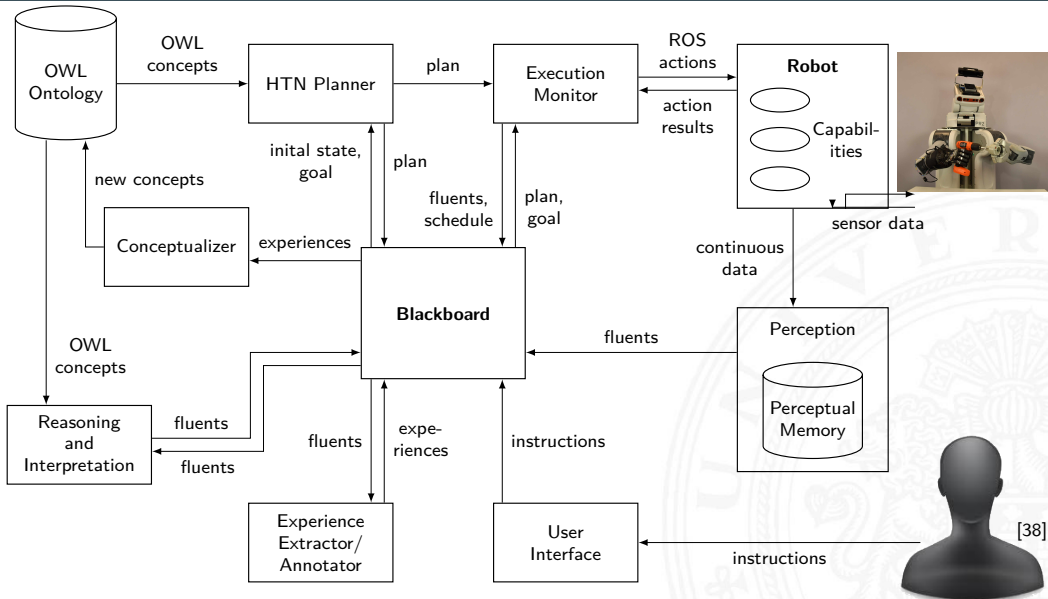
An Architecture for Learning Robots



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RACE

Robustness by Autonomous Competence Enhancement





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