

# Introduction to Cognitive Robotics

## Module 6: Artificial Cognitive Systems

### Lecture 3: Learning and development

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# Learning

## 1. Supervised

Teaching data in the form of required behaviour provide directional error signals

## 2. Reinforcement

Teaching signals are scalar **reward** or reinforcement signals




(maximize the cumulative sum of rewards over time)

## 3. Unsupervised

No teaching signals

(uncover statistical regularities)

# Learning

- Supervised: Cerebellum  Internal models of the environment  
Short-cut models of input-output associations learned elsewhere
- Reinforcement: Basal Ganglia  Evaluate given state;  
Select action
- Unsupervised: Cerebral Cortex  Represent external state & internal context;  
Provide common representational framework for Cerebellum and BG

[Doya 1999]

# Learning

- Hippocampus–Cortex Complementary Learning
- Hippocampus: rapid auto- and hetero-associative learning
- Hippocampus reinstates neo-cortex memories

[McClelland et al. 1995]

# Cognitive Development

## Cognition

- **Anticipating** the need for action
- Formulating the motor commands required to act successfully (**effective action**)
- **Predicting the outcome** of those actions
- **Adaptively** and **prospectively** carrying out those actions

# Cognitive Development

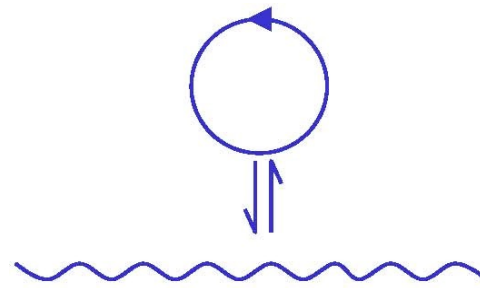
Cognitive development is a process which an agent undergoes to

Expand its repertoire of possible actions

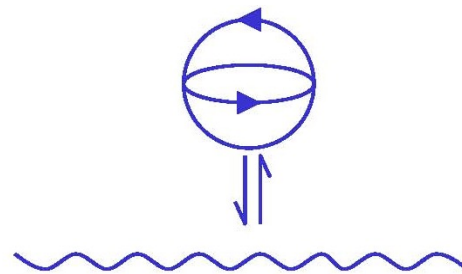
Extend the time horizon of its capacity for prospection:

the ability to anticipate (a) events and (b) the need to act

# Cognitive Development



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Anticipation / Planning / Explanation / Prediction

# Cognitive Development

Development arises due to changes in the central nervous system as a result of dynamic interaction with the environment

- Emergence of new forms of action
- Acquisition of predictive control of these actions

Mastery of action relies critically on **prospection**

- Inference of upcoming events
- Inference of outcome of actions



# Cognitive Development

Discover new ways of doing things

- May need to inhibit existing abilities (i.e. it. may be a non-monotonic process)
- May need to allow for (or cause) changes in the physical structure of the agent

# Cognitive Development

Discover new ways of doing things

- Typically make use of **scaffolding**
- The progressive development of innate skills or skills that are learned early on
- Development is phased

# Cognitive Development

Developing the ability to help others and be helped by others

- 14 to 18 months: **instrumental helping behaviour**
- 2 years: start to solve **simple cooperation** tasks with adults
- 2-3 years: ability to **cooperate** with peers
- 3 years: complex **collaboration**
  - Sharing of intentions
  - Joint coordination of complementary actions
- 3 ½ years: Roles in the task can be reversed; & can teach new partners

# Cognitive Development

The prospective aspect of development is accelerated by **internal simulation**

- Mentally rehearsing — consciously or subconsciously — the execution of actions
- Inferring the likely outcome of those actions

# Cognitive Development

## Exploratory motives

- Discovery of novelty and regularities in the world
- Discovery of the potential of the agent's own actions

# Cognitive Development

## Social motives

- Need to belong
- Self-preservation
- Cognitive consistency with others
- Expressed from birth through tendency to
  - Fixate on social stimuli
  - Imitate basic gestures
  - Engage in social interaction



Jean Piaget (1896–1980)



Lev Vygotsky (1896–1934)



# Learning vs. Development

## Learning

A process for improving the performance of a system

A process for estimating or improving the parameter values that govern the behaviour of a **known model**

## Development

A process for **generating** or discovering the **model** itself

Requires two-way interaction between agent and world

Requires **scaffolding on existing capabilities**

Remark: unsupervised learning and reinforcement learning do this to an extent

