

# Design & Implementation of Cognition-enabled Robot Agents

## Module 10: Cognitive Architectures Lecture 1: Foundations

Institute for Artificial Intelligence  
Universität Bremen

Winter Term 2020/21

# Learning Goals

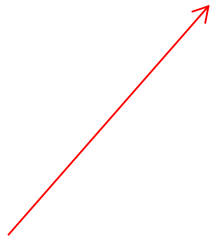
1. Describe the three paradigms of cognitive science
2. Explain the characteristics of a cognitive architecture in each of the three paradigms
3. Describe the key components of a hybrid cognitive architecture
4. Sketch the design of the ISAC and CRAM cognitive architectures and explain how they operate

# Lecture Contents

1. What are the characteristics of a cognitive agent?
2. What is a cognitive architecture?
3. How does a cognitive architecture work?
4. The three paradigms of cognitive science
  - Cognitivist (symbolic) cognitive architectures
  - Emergent cognitive architectures
  - Hybrid cognitive architectures
5. Lecture summary
6. Recommended reading & references

# 1. What are the characteristics of a cognitive agent?

The chief characteristic of a cognitive agent is the ability to **act effectively** in pursuing goals in a world that is **uncertain**, **under-specified**, and **dynamic**, possibly cooperating with other cognitive agents



To achieve goals adaptively and robustly in these circumstances requires a **complex system** that can

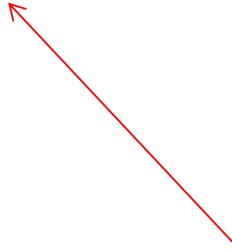
- **Construct models** of the way the world works,
- Use them to **guide actions prospectively**, and
- **Update them dynamically** as the system continually **learns** through its interactions

A cognitive architecture is the way we specify what is required to achieve this.

## 2. What is a cognitive architecture?

A cognitive architecture is a software framework that **integrates all the elements** required for **a system** to exhibit the **characteristic attributes** of a cognitive agent

The design of a cognitive architecture requires the specification of the **formalisms** for all the **processes** and **knowledge representations** used by that framework




### 3. How does a cognitive architecture work?

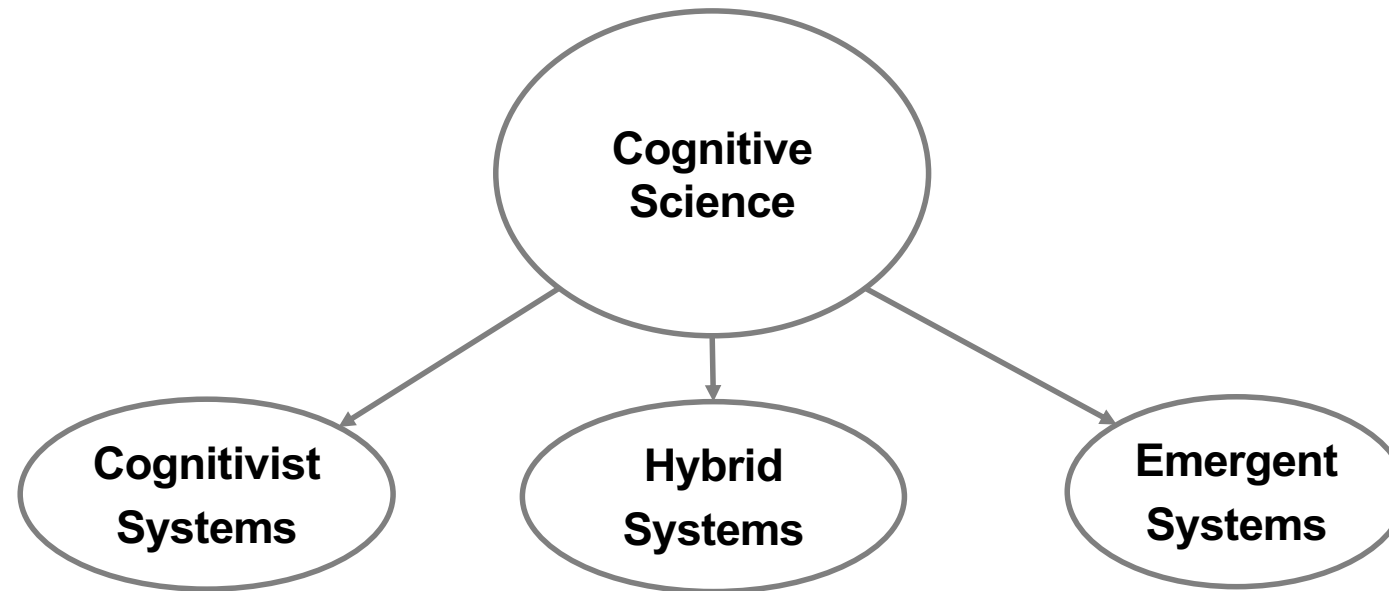
A cognitive architecture integrates the **core cognitive abilities** so that these abilities can be **dynamically coordinated**

Allowing the agent to exhibit **flexible context-sensitive** behaviour, **prospectively selecting** and **controlling** the **actions** that are required to achieve given **goals**

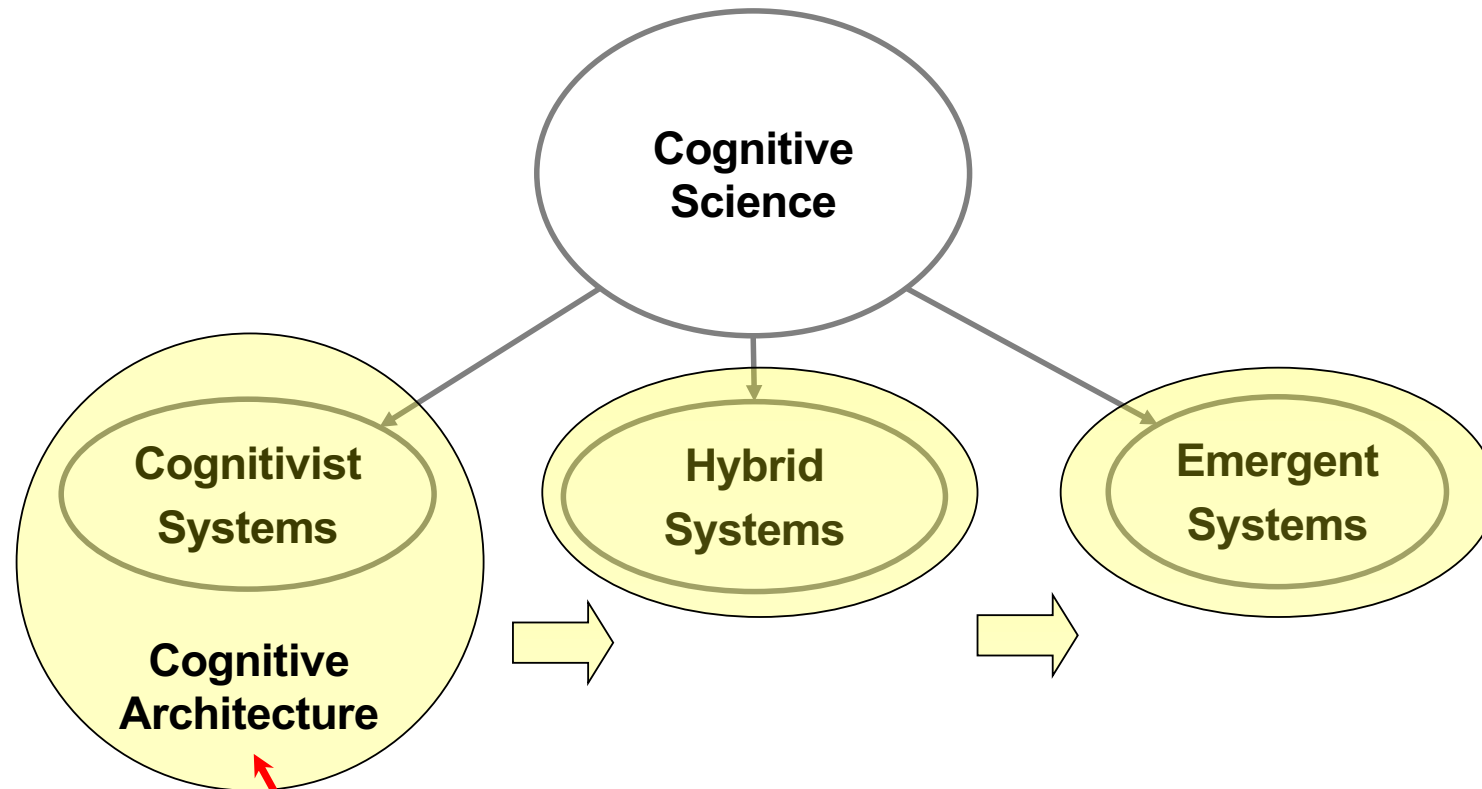
A cognitive architecture should also be able to develop autonomously so that its performance improves over time with experience



- Perception
- Attention
- Action selection
- Memory
- Learning
- Reasoning
- Meta-reasoning
- Prospection



There are three paradigms of cognitive science



The term originated with the work of A. Newell (1990)



# Cognitivist Cognitive Architecture

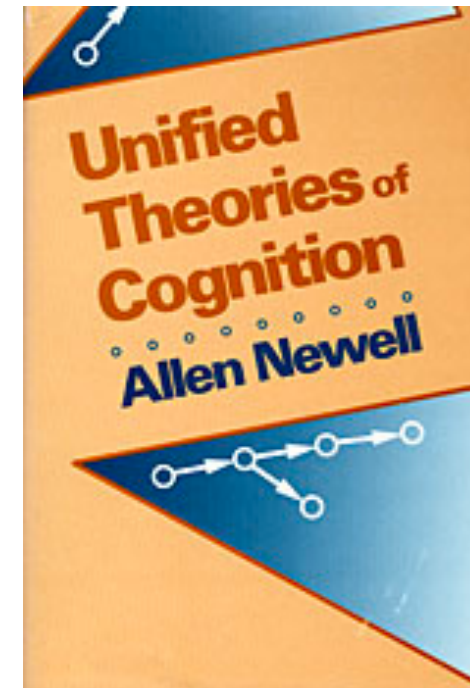
Attempts to create **Unified Theories of Cognition (UTC)**

UTCs cover a broad range of cognitive issues

- Attention
- Memory
- Problem solving
- Decision making
- Learning

from several aspects

- Psychology
- Neuroscience
- Computer Science



<https://www.hup.harvard.edu/catalog.php?isbn=9780674921016>

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**The 1987 William James Lectures**  
**UNIFIED THEORIES OF COGNITION**

**CHAPTER 3**  
**HUMAN COGNITIVE ARCHITECTURE**

**DRAFT 1**

Allen Newell  
4 August 1987

Departments of Computer Science and Psychology  
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*check of p. 16 (where does it go?)*

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# Cognitivist Cognitive Architecture

An encapsulation of a scientific hypothesis about those aspects of human cognition that are

- relatively **constant over time** and
- relatively **independent of task**

[Ritter and Young 2001]

# Cognitivist Cognitive Architecture

- Generic computational model:
  - Not domain-specific
  - Not task-specific
- Knowledge provides the required specificity:

Cognitive Architecture + Knowledge = Cognitive Model

- Lehman et al. (1998) put it slightly differently:

BEHAVIOR = ARCHITECTURE x CONTENT

# Cognitivist Cognitive Architecture

Knowledge is typically:

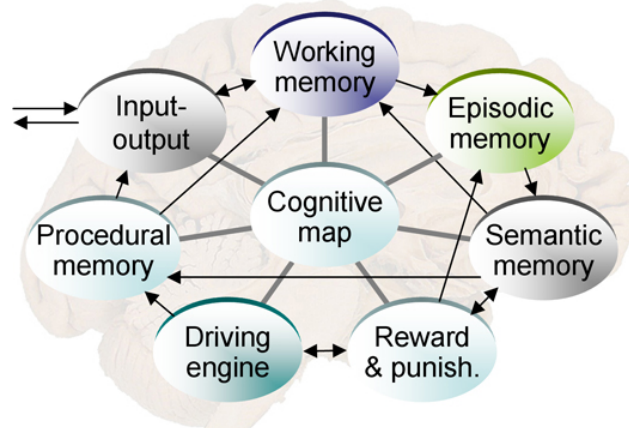
- Determined by the **designer** (explicitly or implicitly)
- Adapted and augmented by **machine learning** techniques

# Cognitivist Cognitive Architecture

## Overall structure and organization of a cognitive system

- Essential **modules**
- Essential **relations** between these modules
- Essential **algorithmic** and **representational details** in each module

(Sun 2007)



GMU BICA Architecture (Samsonovich 2010)

Commitment to formalisms for **representation** and **processes**

(Langley 2005, Langley 2006, Langley et al. 2009)

# Emergent Cognitive Architecture

Emergent approaches focus on **development**

- From a primitive state
- To fully cognitive state, over the system's lifetime



<https://childmaltreatmentresearchblog.wordpress.com/about/>

# Emergent Cognitive Architecture

- Two different views of development
  - Individual
  - Social
- Two complementary theories of cognitive development



Jean Piaget  
1896–1980

[https://en.wikipedia.org/wiki/Jean\\_Piaget](https://en.wikipedia.org/wiki/Jean_Piaget)



Lev Vygotsky  
1896–1934

[https://en.wikipedia.org/wiki/Lev\\_Vygotsky](https://en.wikipedia.org/wiki/Lev_Vygotsky)



# Emergent Cognitive Architecture

The cognitive architecture is the system's **phylogenetic configuration**

- The basis for **ontogenesis**, i.e. growth and development
  - Innate skills
  - Core knowledge
  
- A structure in which to embed mechanisms for
  - Perception
  - Action
  - Adaptation
  - Anticipation
  - Motivation
  - ... **Development of all these**

# Emergent Cognitive Architecture

Strong focus on

- Autonomy-preserving, **anticipatory**, **adaptive** skill construction
- The **morphology** of the physical body in which the architecture is embedded

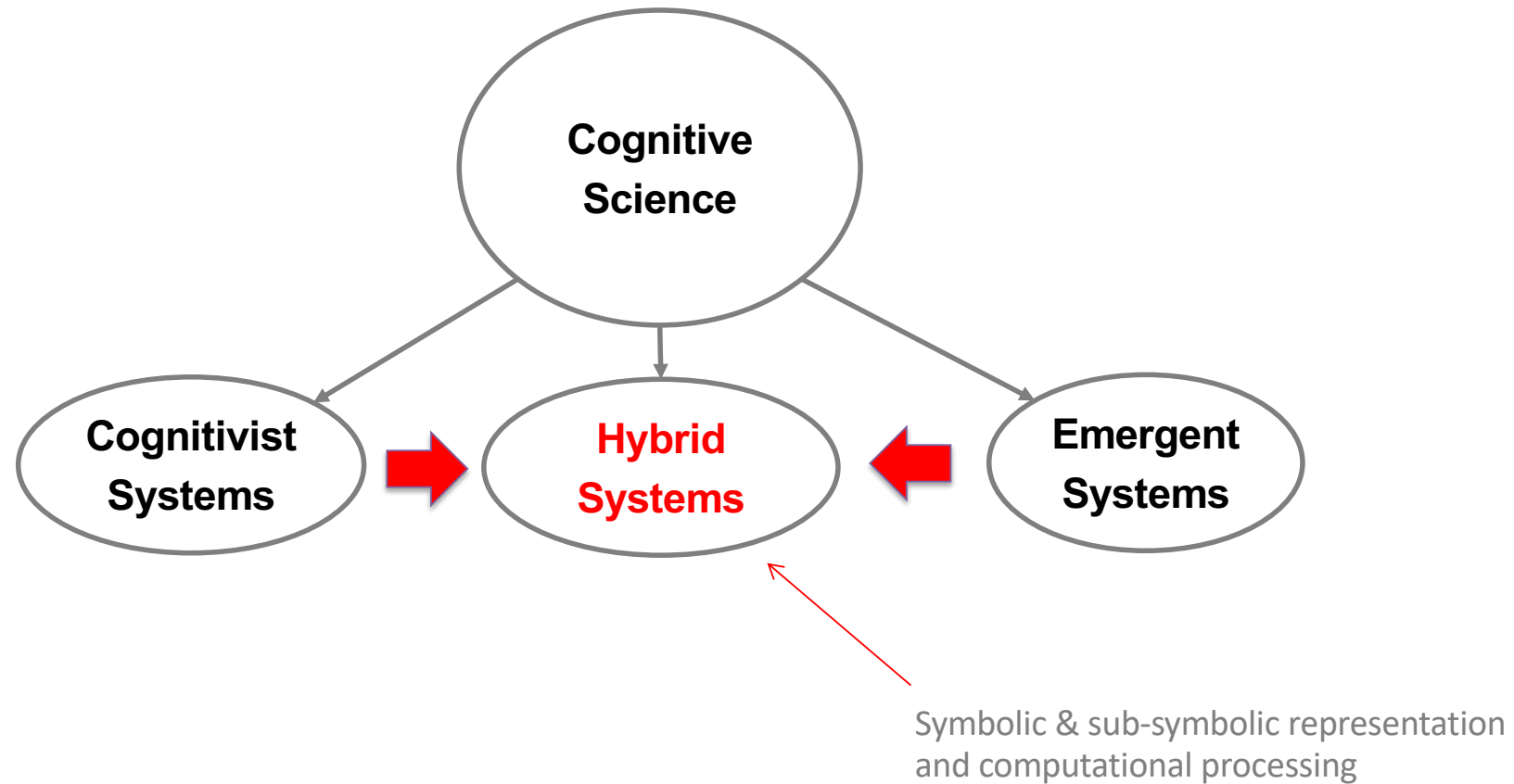
# Emergent Cognitive Architecture

The emergent approach rejects:

- **Dualism** between mind and body
- **Functionalism** that treats cognitive mechanisms independently of the physical platform
  - Computational functionalism
  - Robotic functionalism

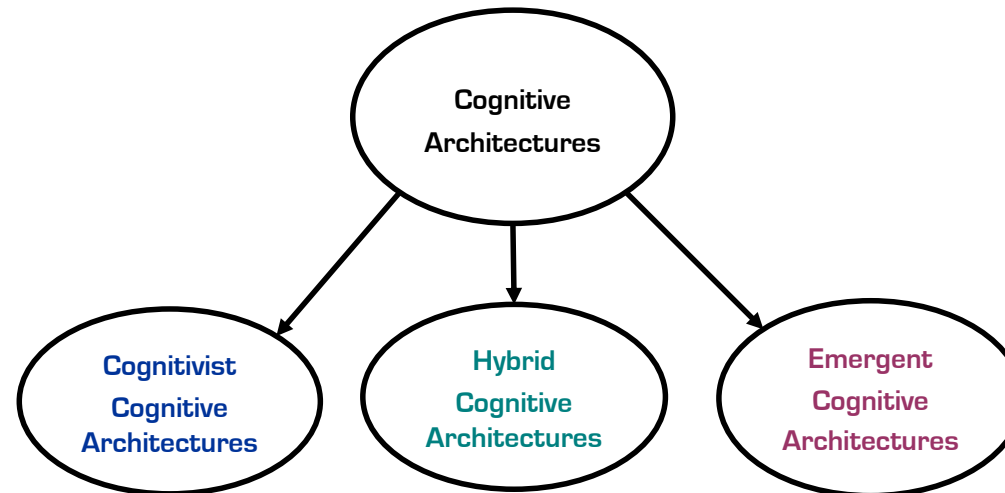
[Ziemke 2016]

# Hybrid Cognitive Architecture



## Organizational decomposition

- Explicit inter-connectivity
- Representational formalism
- Algorithmic formalism



### Framework in which to embed **knowledge**

- Memories
- Formalisms for learning
- Programming mechanism

### Phylogeny - basis for **development**

- Innate skills & core knowledge
- Memories
- Formalism for autonomy
- Formalism for development

# Lecture Summary

1. The chief characteristic of a cognitive agent is the ability to act effectively in pursuing goals in an uncertain, incompletely-specified world
2. A cognitive architecture is a framework that integrates all the elements and core abilities of a cognitive system
3. It dynamically recruits these elements so that the agent exhibits flexible context-sensitive behaviour and prospective selection and control of its actions
4. A cognitive architecture specifies the formalisms for knowledge representation and processing
5. There are three types of cognitive architecture: cognitivist (symbolic), emergent, and hybrid

# Recommended Reading

D. Vernon, *Artificial Cognitive Systems – A Primer*, MIT Press, 2014; Chapter 3: Cognitive Architectures.

D. Vernon. "Cognitive Architectures", in *Cognitive Robotics*, A. Cangelosi and M. Asada (Eds.), MIT Press, in press.

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