

# Neural Process Models for Intentional States

Jan Tekülve

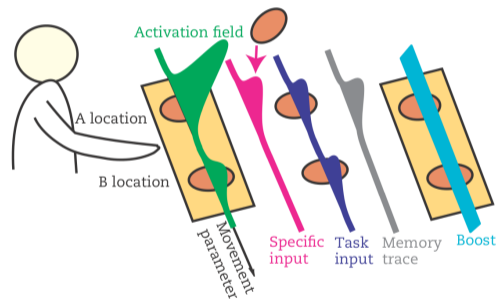
Institute for Neural Computation  
Ruhr-Universität Bochum

04.09.2020

# Motivation

## Spectrums of Dynamic Field Theory

- Models capturing psycho-physical data



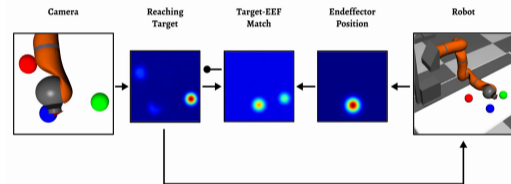
[Thelen et al., 2001]



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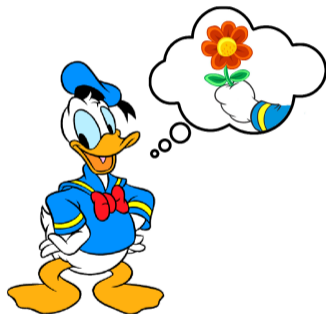
- ▶ Models capturing psycho-physical data
- ▶ Models capturing behavioral competences



# Motivation

## Spectrums of Dynamic Field Theory

- ▶ Models capturing psycho-physical data
- ▶ Models capturing behavioral competences
- ▶ Models capturing intentional agents?



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- ▶ How are intentional states stabilized in time?

# Intentionality

*The capacity of the nervous system to generate mental states that are “about” things in the world.*

- ▶ “Things in the world” include the agent’s body and its mental states
- ▶ How may intentional states emerge from neural processes?
- ▶ How are intentional states stabilized in time?
- ▶ Under which circumstances are intentional states destabilized?

# Intentional States

- ▶ Defined through a **content** and a **psychological mode**

## World-to-Mind Direction of Fit

- ▶ Picking a *red flower* in front of me (Intention-in-Action)
- ▶ Pick a *red flower* later in the park (Prior Intention)
- ▶ Wanting a *red flower* (Desire )

## Mind-to-World Direction of Fit

- ▶ Seeing a *red flower* in front of me (Perception)
- ▶ Recall a *red flower* growing in the park (Memory)
- ▶ *Red flowers* have a green stem (Belief)



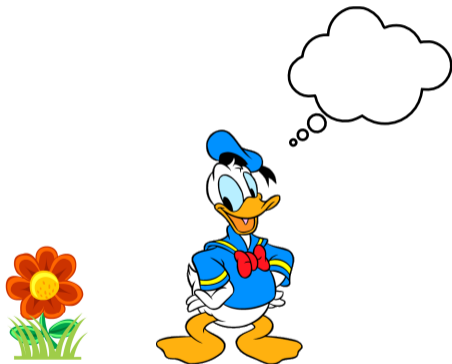
content

[*Intentionality: An essay in the philosophy of mind*, Searle, 1983]



# Directions of Fit: Mind-to-World

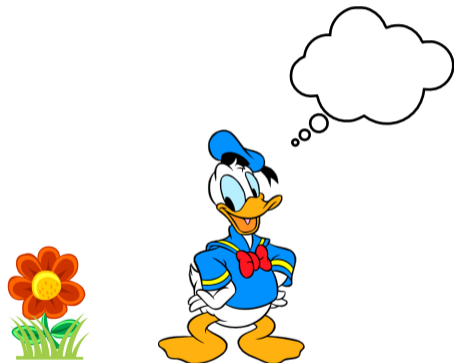
1.



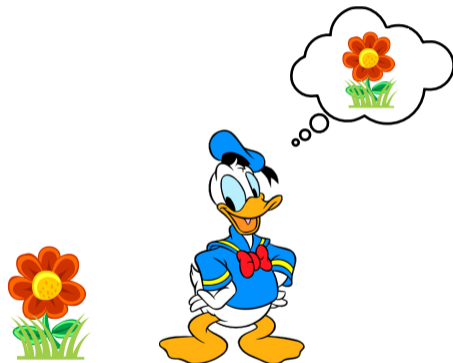
Example: *Perception*

## Directions of Fit: Mind-to-World

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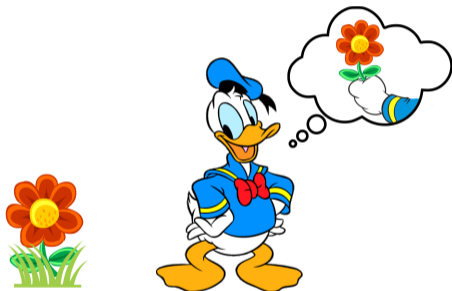
2.



Example: *Perception*

# Directions of Fit: World-to-Mind

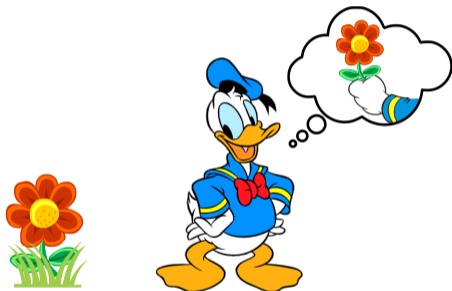
1.



Example: *Intention-in-Action*

## Directions of Fit: World-to-Mind

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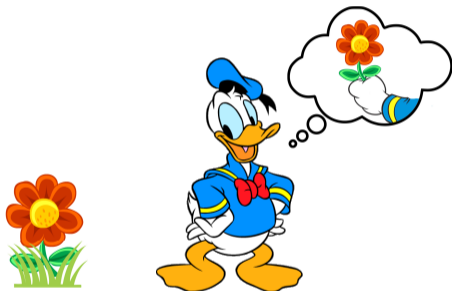
2.



Example: *Intention-in-Action*

## Directions of Fit: World-to-Mind

1.



2.

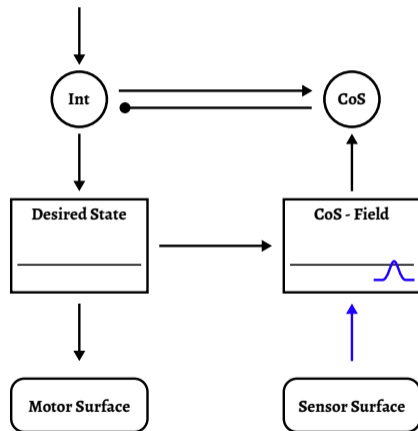


Example: *Intention-in-Action*

**Condition of Satisfaction:** Is the fit achieved?

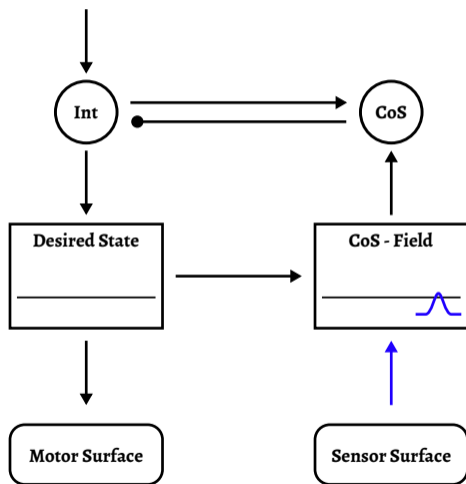
## A neural Process Model

- ▶ Detects CoS based on sensor information
- ▶ Represents action initiation and termination
- ▶ Drives motor behavior

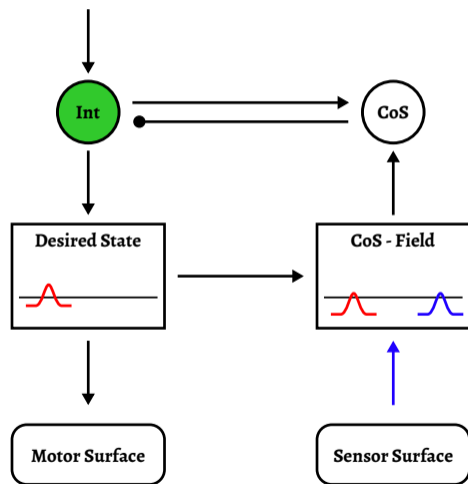


[Sandamirskaya and Schöner, 2010]

## Condition of Satisfaction Network

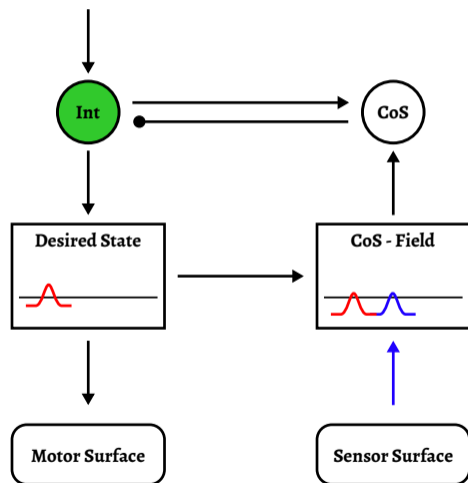


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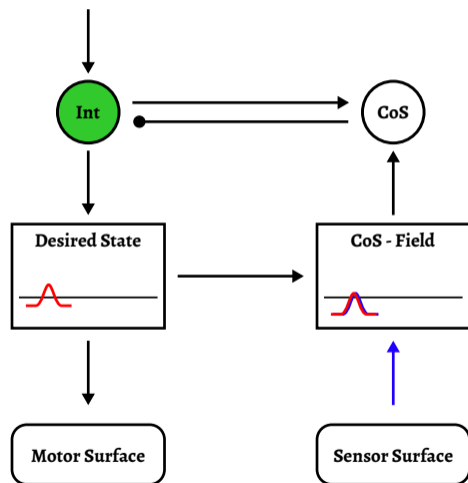




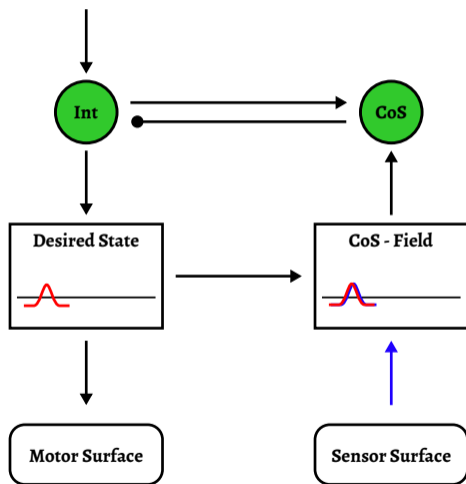
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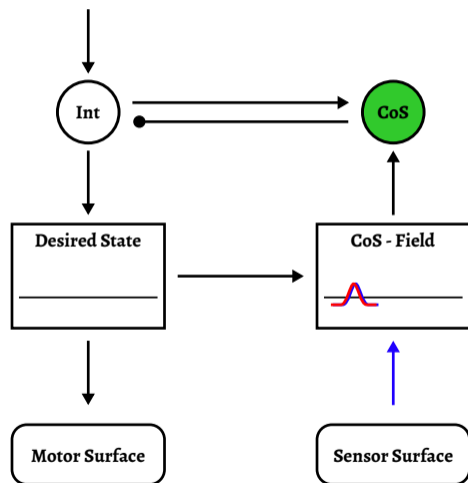
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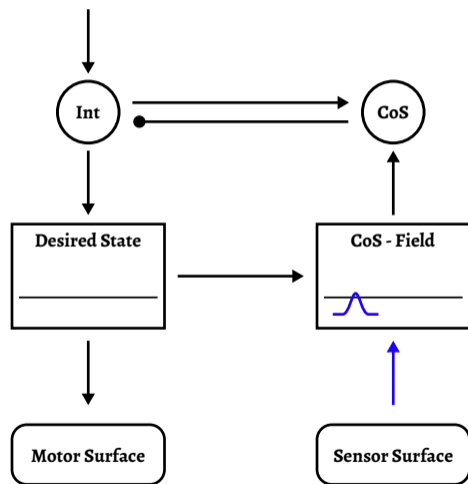
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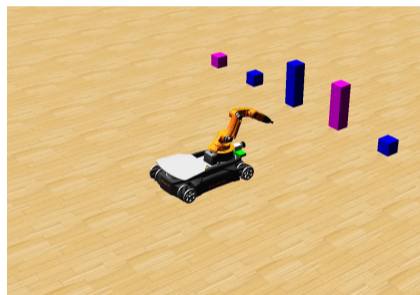


## Condition of Satisfaction Network



## A simple Painting Scenario

- ▶ Toy scenario includes six different psychological modes
- ▶ Behavior emerges from autonomous transitions between intentional states
- ▶ Stabilized intentional states make up experience
- ▶ Experience allows the formation of categorical beliefs



[Tekülve and Schöner, 2019]

# Mind-To-World States

## ▶ Perception

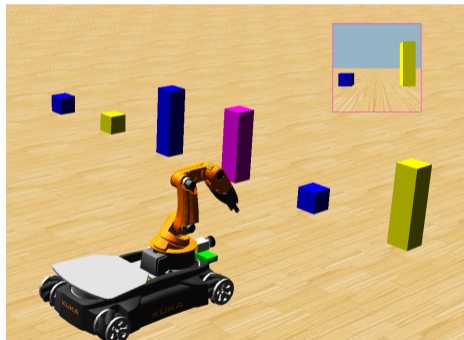
- ▶ See Objects (Position, Height, Color)
- ▶ Observe Color Change
- ▶ Sense Position, Arm, Paint-Device Status

## ▶ Memory

- ▶ Objects in World Space

## ▶ Belief

- ▶ Paint Rules  
(Coat Color + Canvas Color = Result Color)



# World-To-Mind States

## ▶ Intention-in-Action

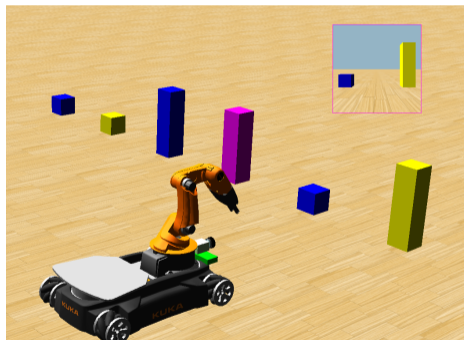
- ▶ Move in 1-D Space
- ▶ Reach for Objects
- ▶ Pick-Up/Dispense Color
- ▶ Invoke certain Mind-to-World States

## ▶ Prior Intention

- ▶ Locate an Object
- ▶ Collect a certain Coat
- ▶ Apply Coat on a certain Canvas

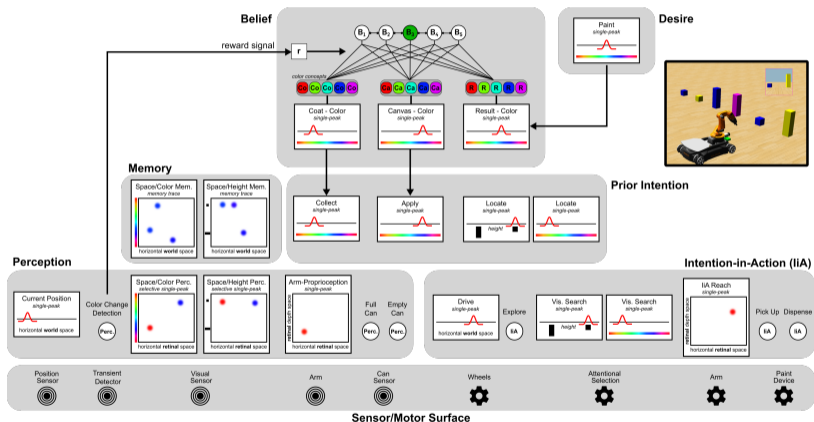
## ▶ Desire

- ▶ Create a certain Color

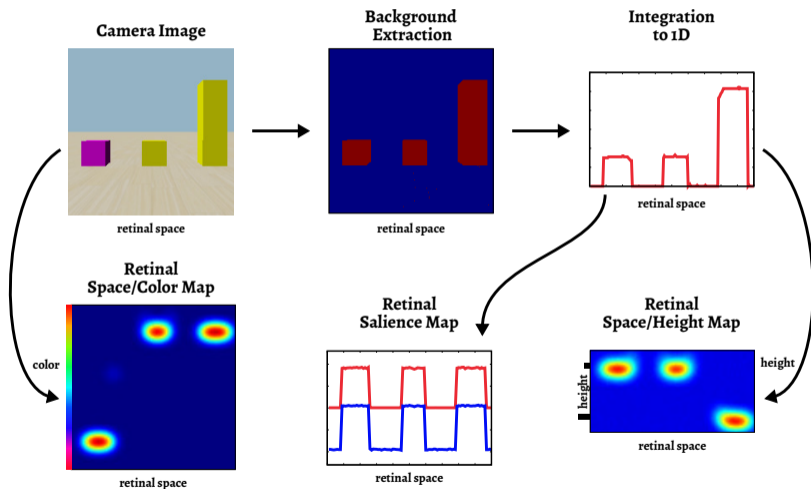




# Architecture Overview

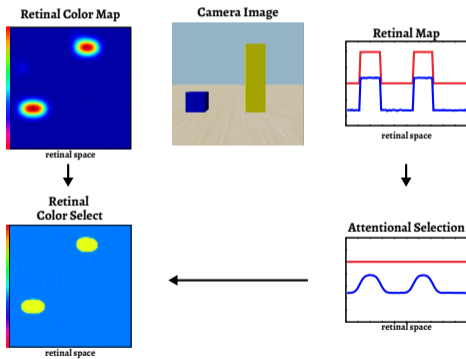


# From Sensor to Field

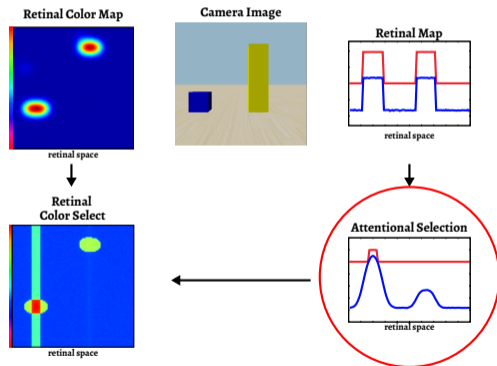


# Process Model: Perception

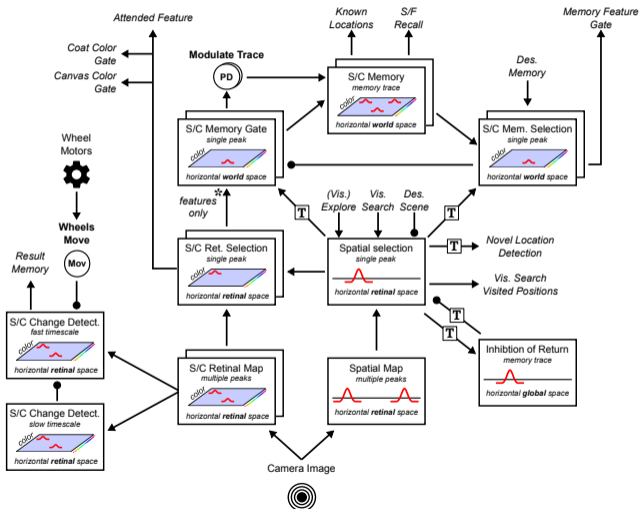
No Perception



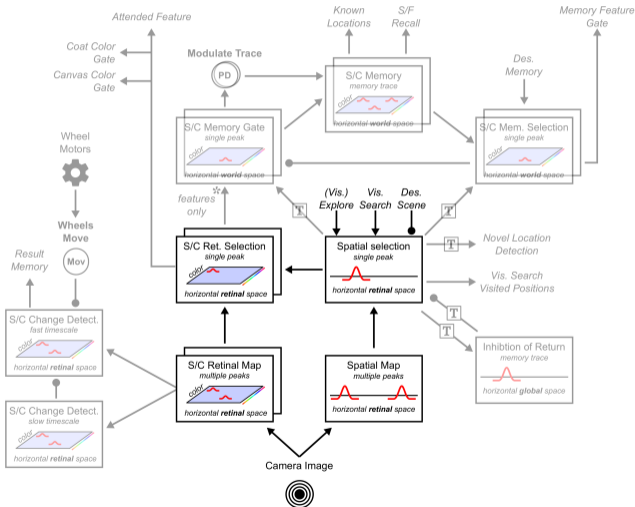
Perception



# Scene Representation: Perception and Memory

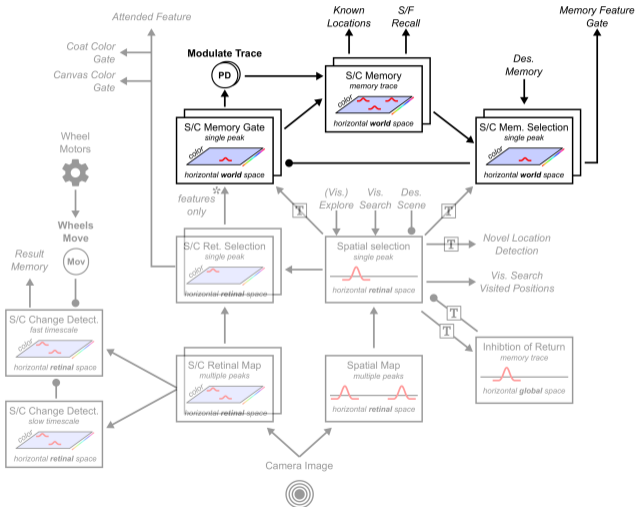


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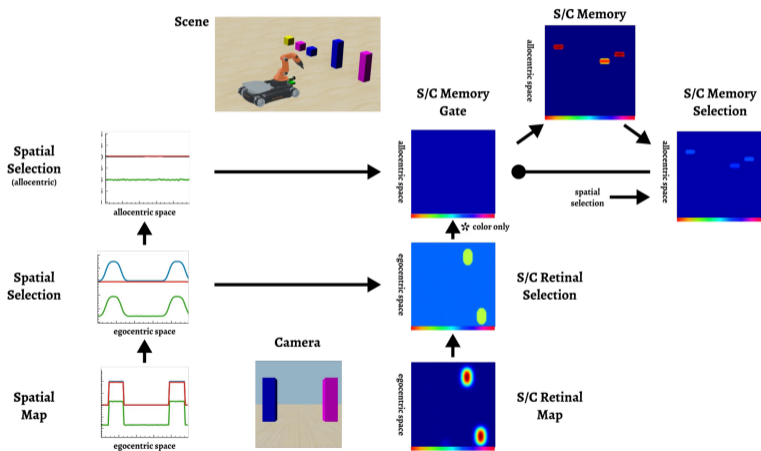




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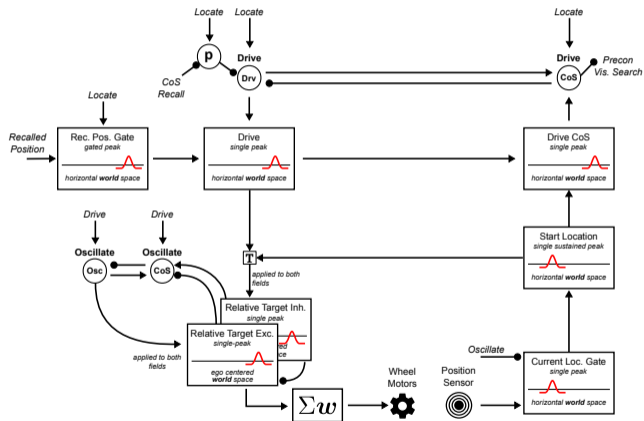


# Memory Buildup

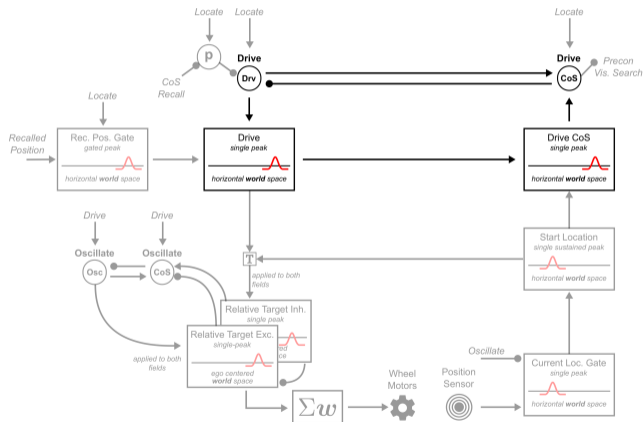




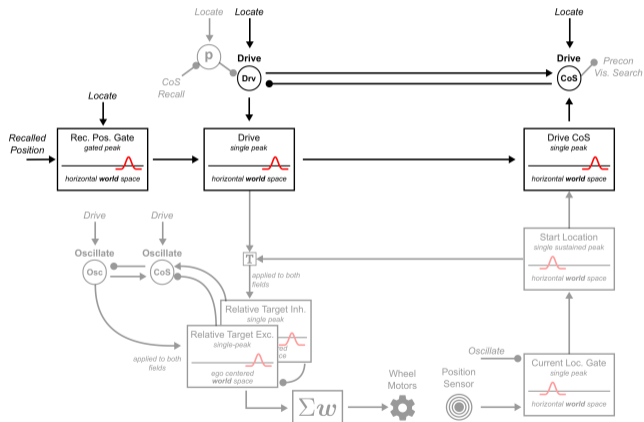
# Example: Goal-Directed Driving



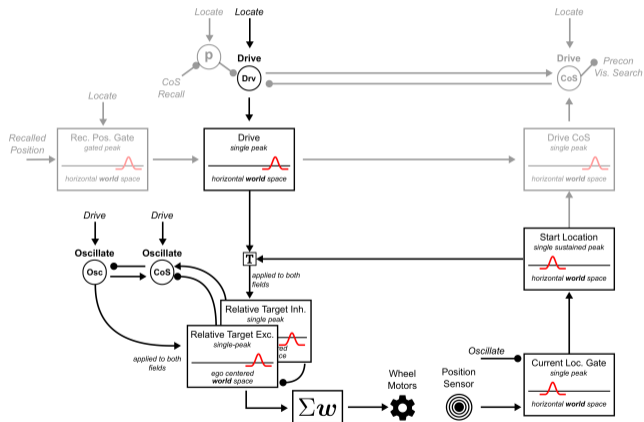
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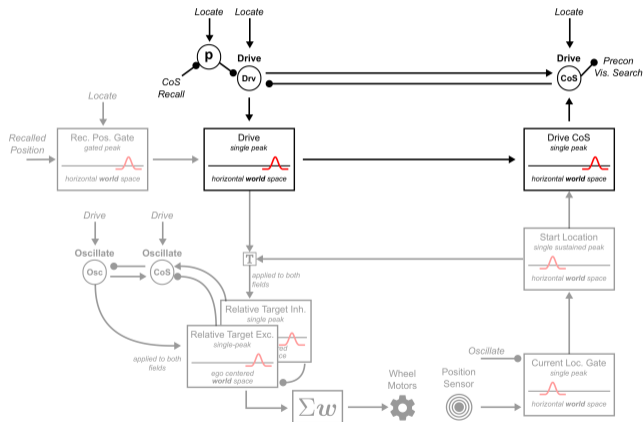
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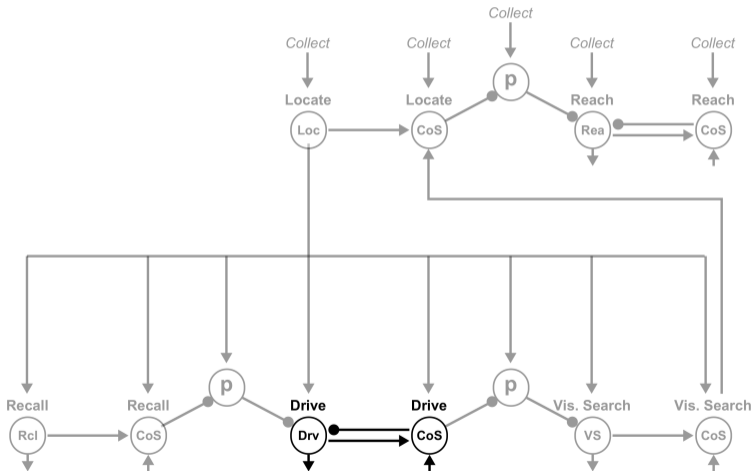
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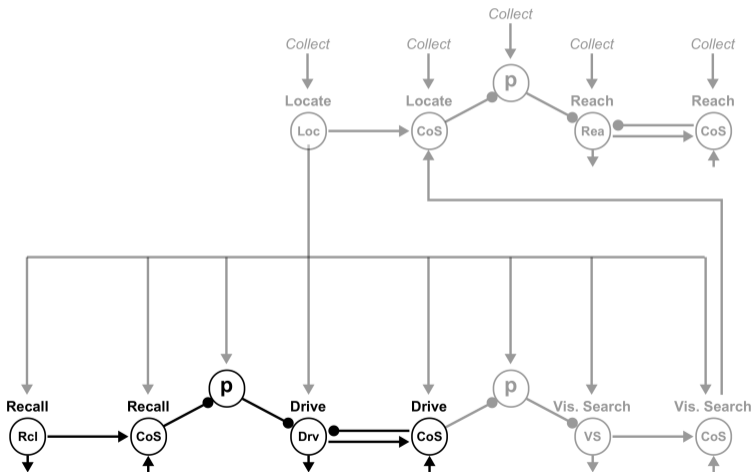
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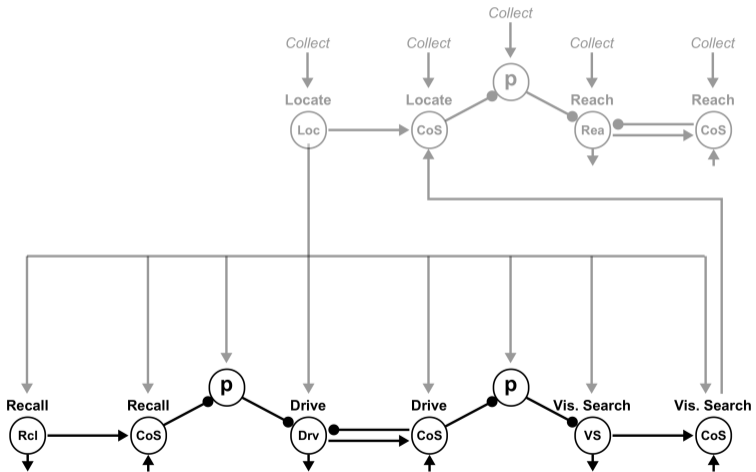
# Prior Intentions



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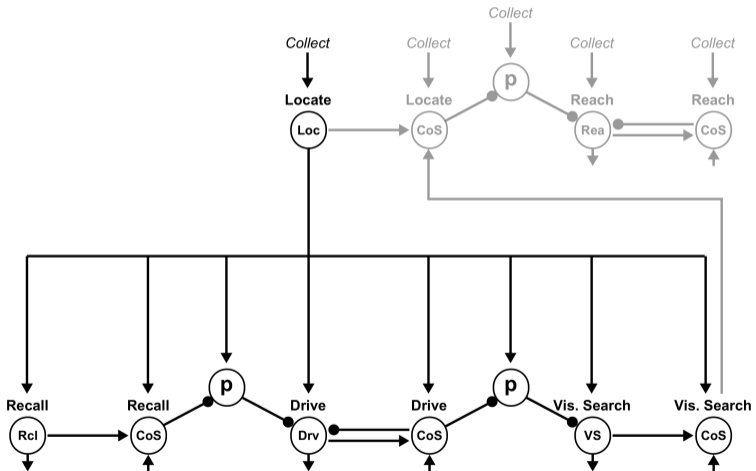


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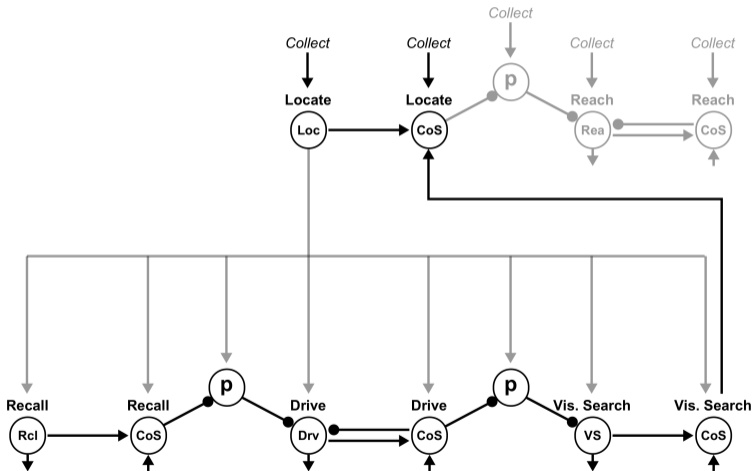




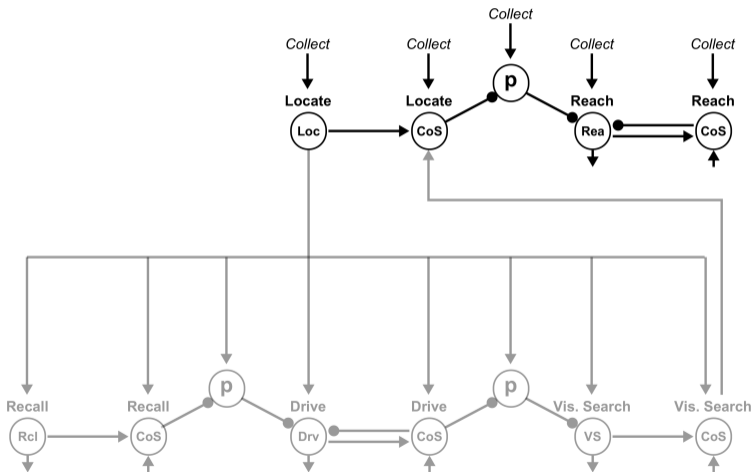
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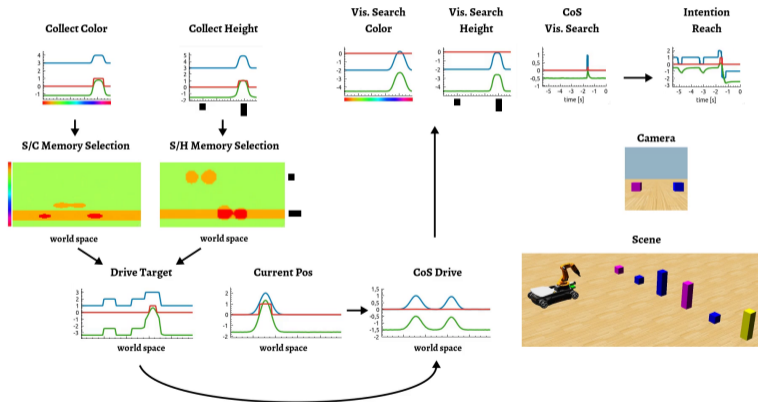
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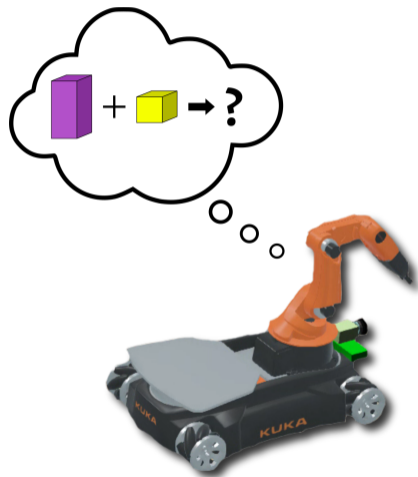
# Collecting Sequence



# Autonomous Learning

## ► Requirements:

- Autonomous action
- Meaningful experience



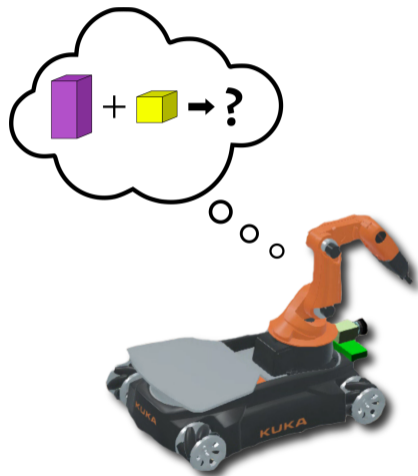
# Autonomous Learning

## ► Requirements:

- Autonomous action
- Meaningful experience

## ► Problems:

- Content abstraction
- Temporal organization



# Beliefs

- ▶ Learning from a single episode

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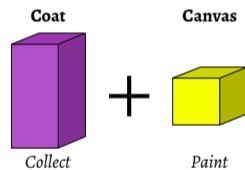
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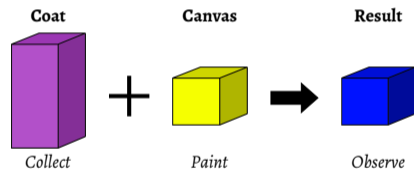
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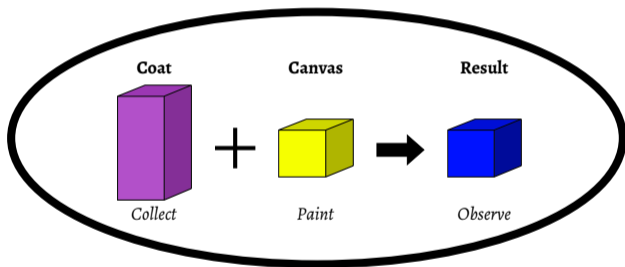
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- ▶ Learning from a single episode
- ▶ Cued activation to guide behavior

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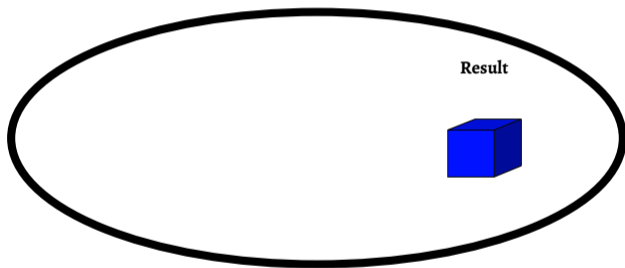
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**Result**



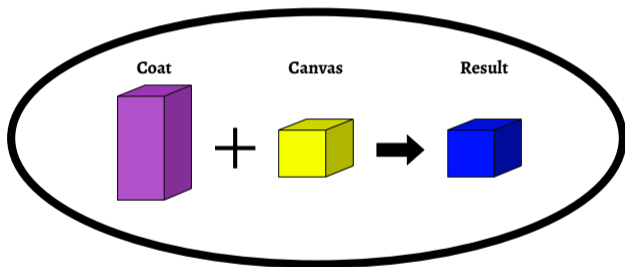
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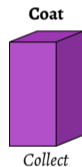
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- ▶ Learning from a single episode
- ▶ Cued activation to guide behavior
- ▶ Rejection in the face of conflicting evidence



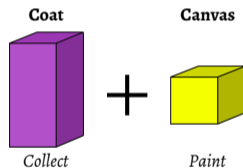
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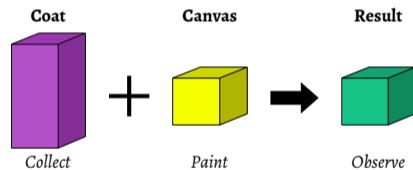
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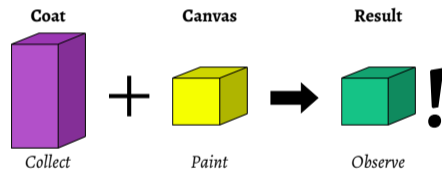
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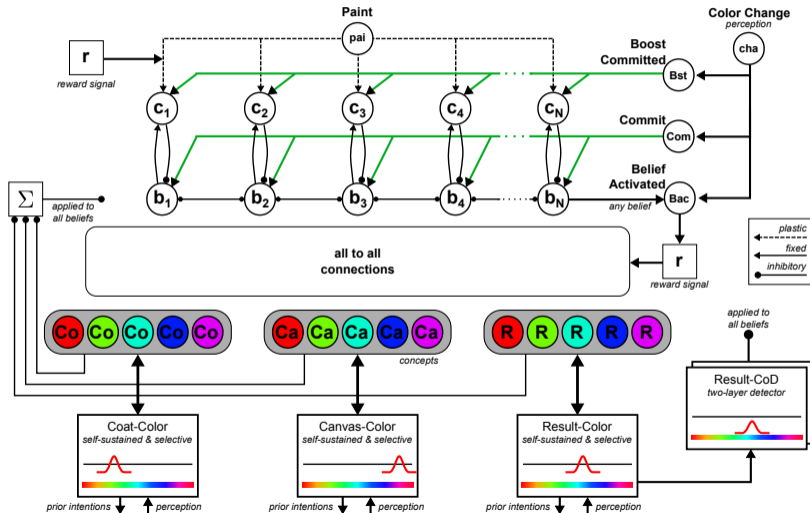


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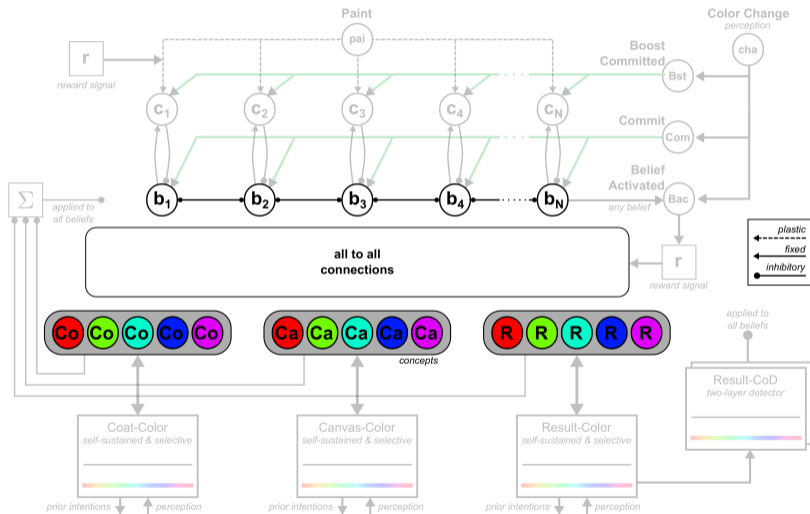
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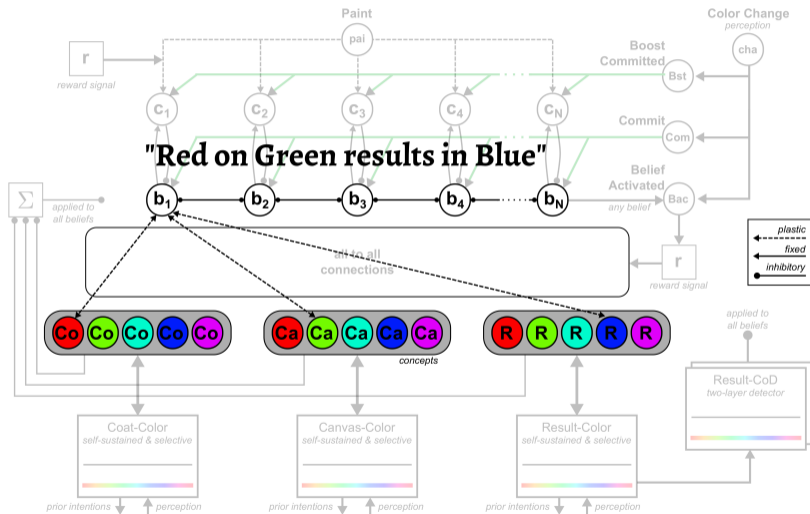
# Belief Architecture



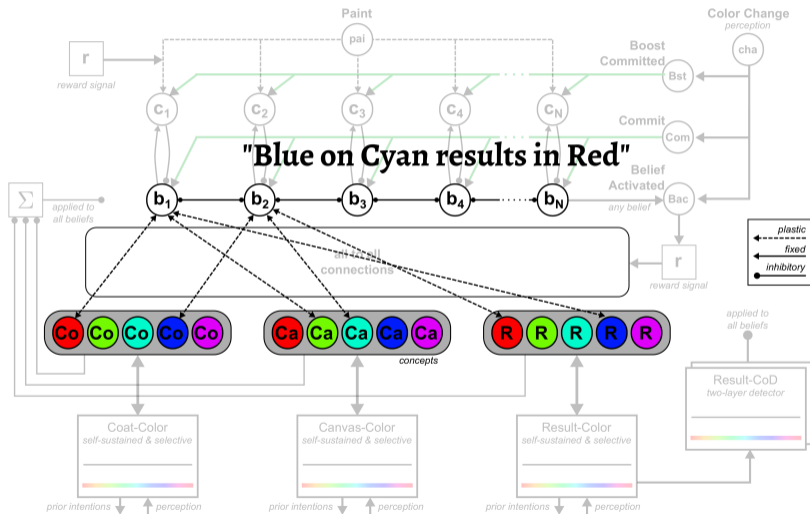
# Belief Architecture



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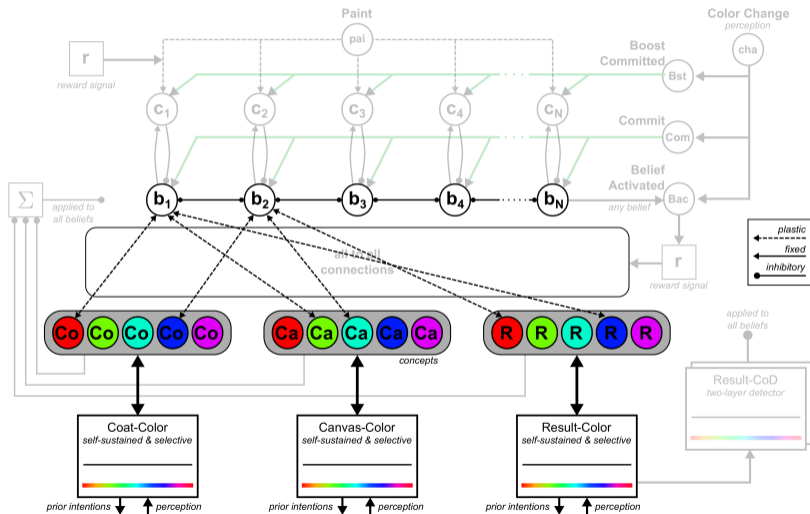


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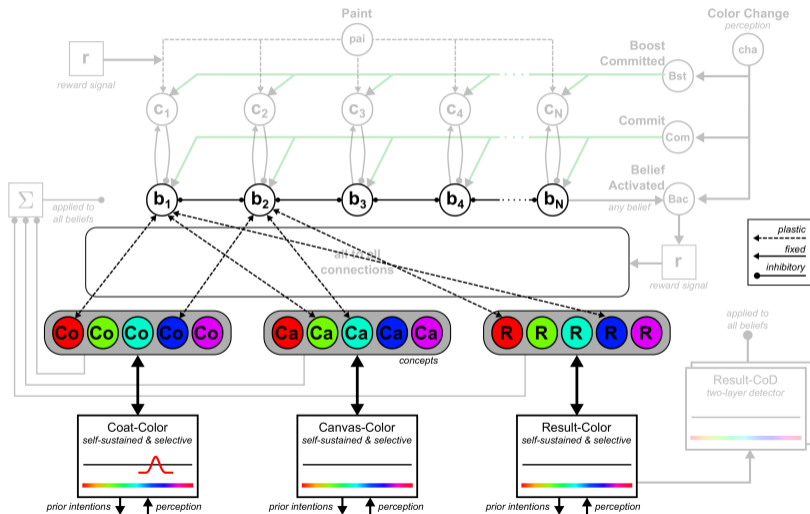




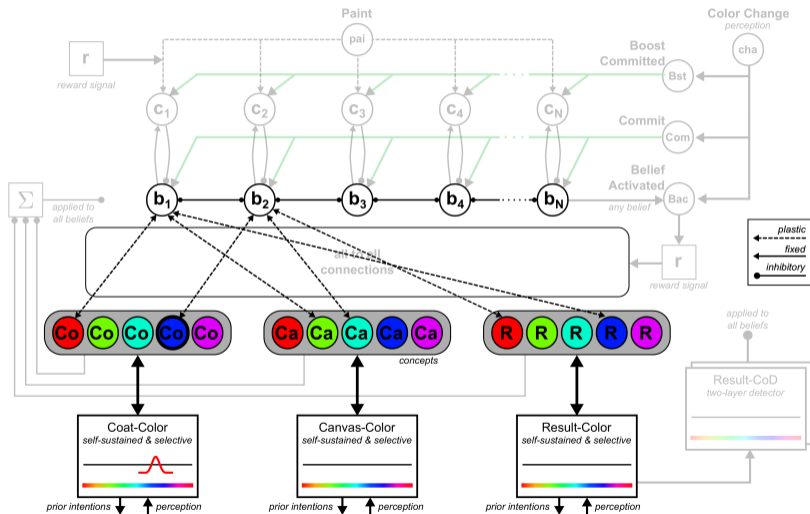
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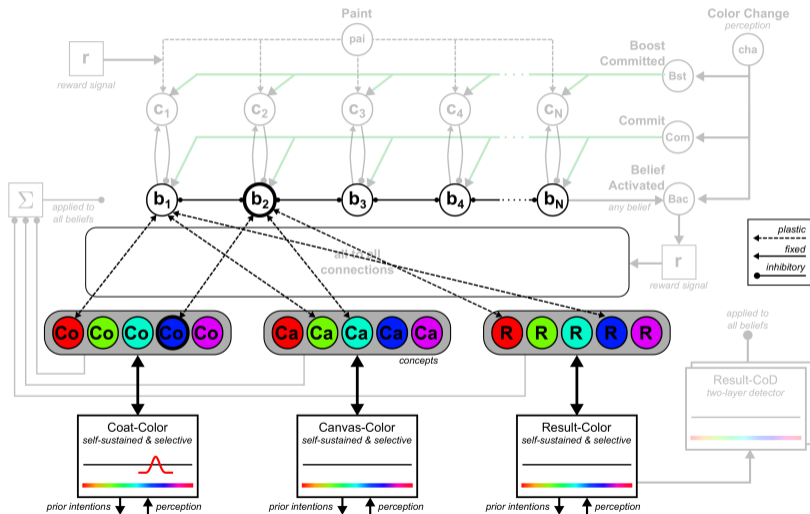
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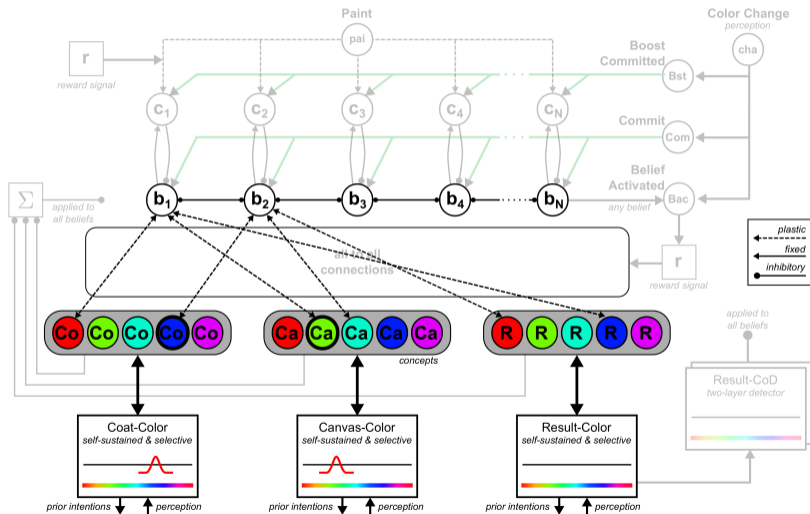
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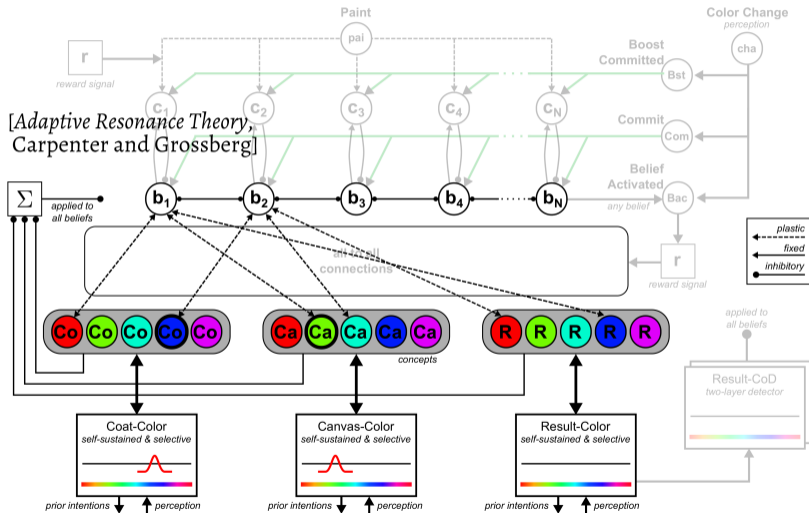
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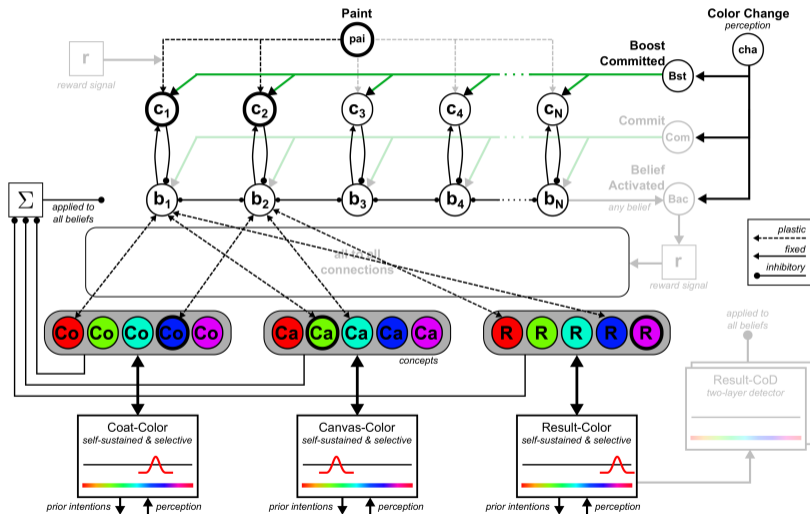
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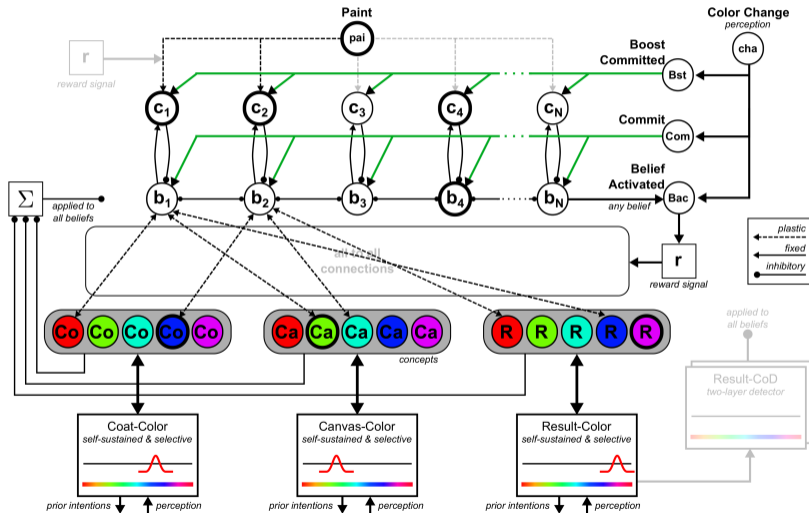
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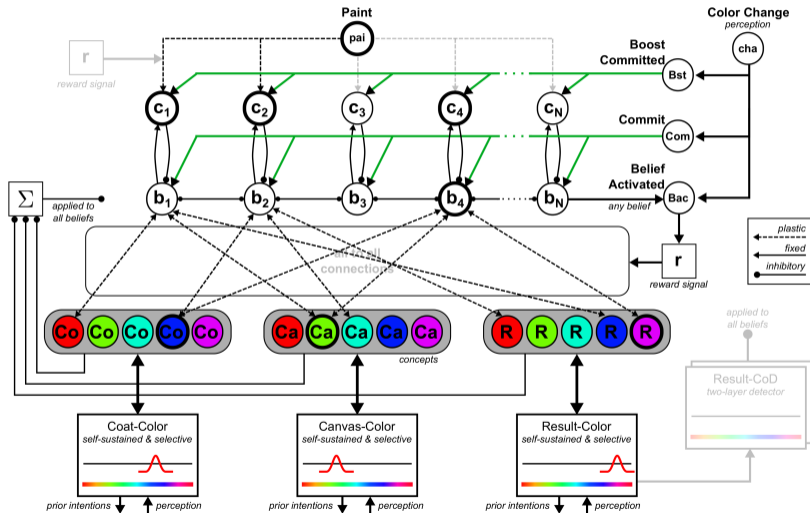


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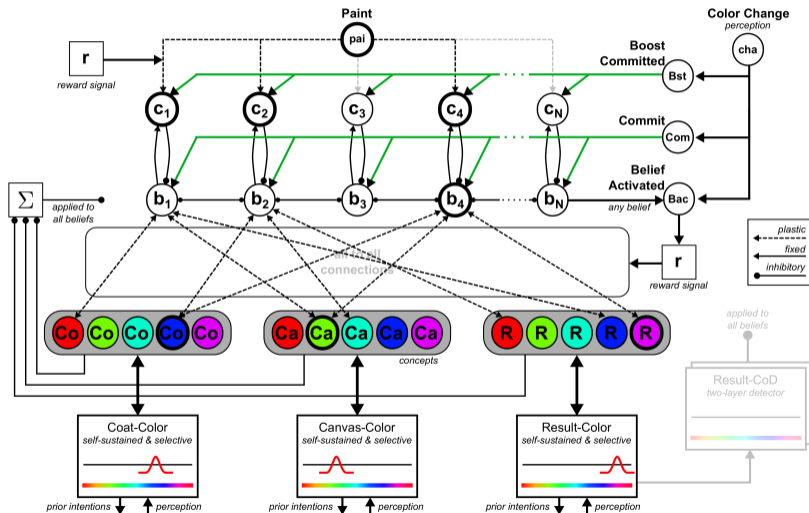




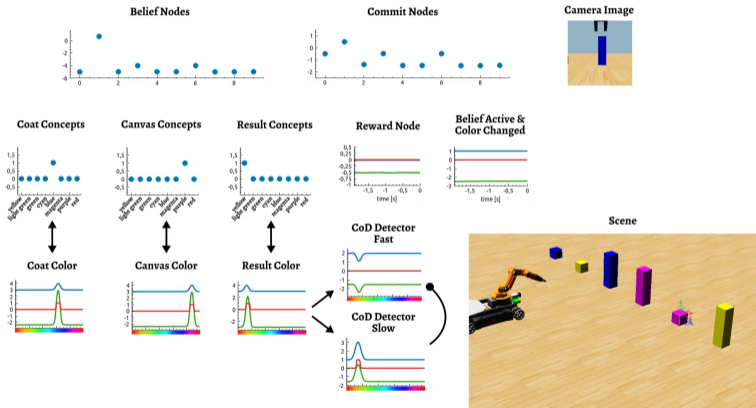
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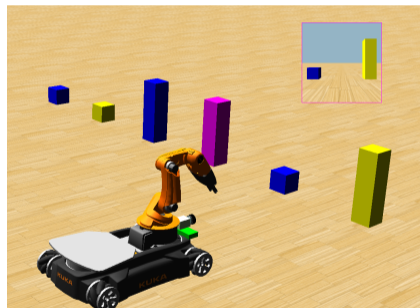


# Belief Recall and Rejection



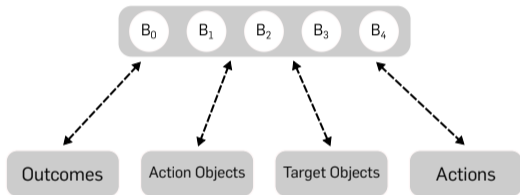
# Conclusion

- ▶ From sensorimotor surface to abstract representations in continuous time
- ▶ Process models of different psychological modes
- ▶ Models reveal necessary infrastructure to stabilize learning

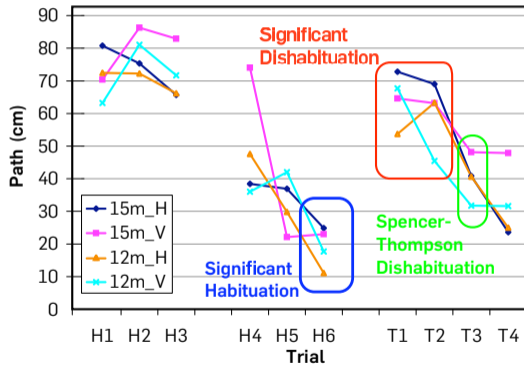


# Outlook

## Generalizing Beliefs



## Desire Dynamics



[Aerdker, Feng, Schöner, 2020]

# Thank you for your attention!

Interested in Dynamic Field Modeling?  
Try our simulation framework cedar!

[cedar.ini.rub.de](http://cedar.ini.rub.de)

Pre-built apps for:  
Linux, Mac OS and Windows



# Bibliography



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