

# (Impressions from) AI applications in Robotics

Applied artificial intelligence (EDAF70)

Lecture 14

2018-03-08

Elin A. Topp

Course book (chapters 15 and 25), images & movies from various sources, and original material  
(Some images and all movies will be removed for the uploaded PDF)

# Outline

## AI in Robotics - integrating the “brain” into the “body”

- Probabilistic methods for Mapping & Localisation (recap Kalman filter)
- SJPDFs for person tracking
- Identifying interaction patterns in Human Augmented Mapping with BNs
- Knowledge representation, reasoning, and NLP to support HRI and high-level robot programming
- (Reinforcement) Learning in robotics
- Deliberation & High level decision making and planning

# HRI - going beyond pressing buttons

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Human-Robot Interaction is quite new as a research field of its own

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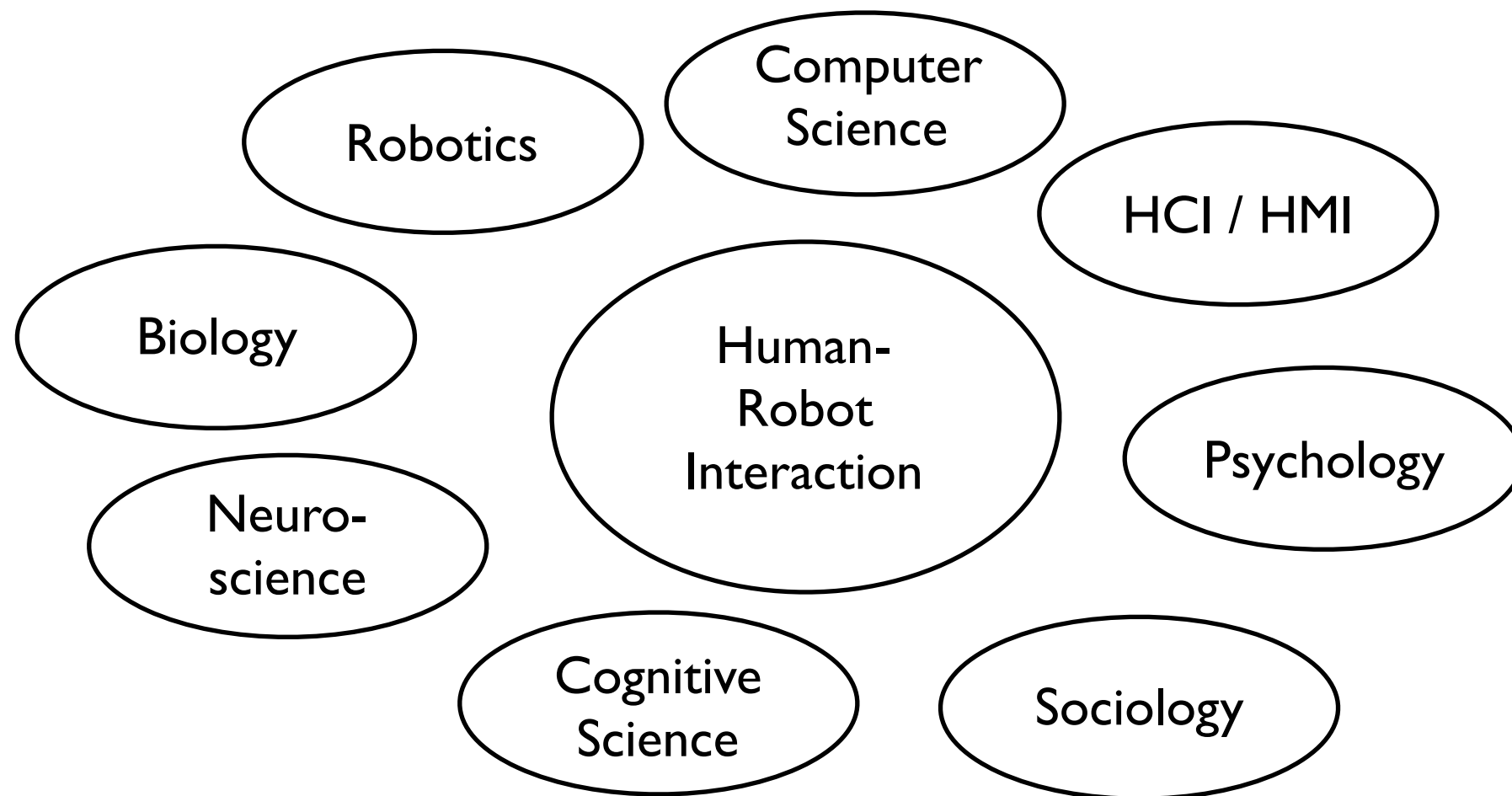
Human-Robot Interaction is quite new as a research field of its own

Like AI and Robotics themselves it is quite multidisciplinary

# HRI - going beyond pressing buttons

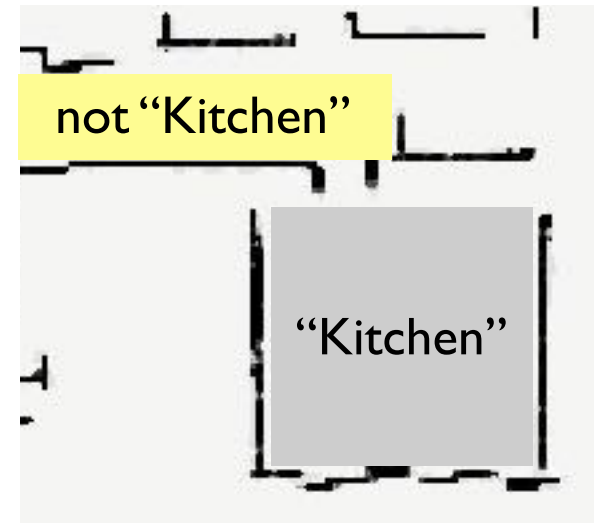
Human-Robot Interaction is quite new as a research field of its own

Like AI and Robotics themselves it is quite multidisciplinary



# Human augmented mapping - an example for work in HRI

- Integrate robotic and human environment representations



- Home tour / guided tour as initial scenario



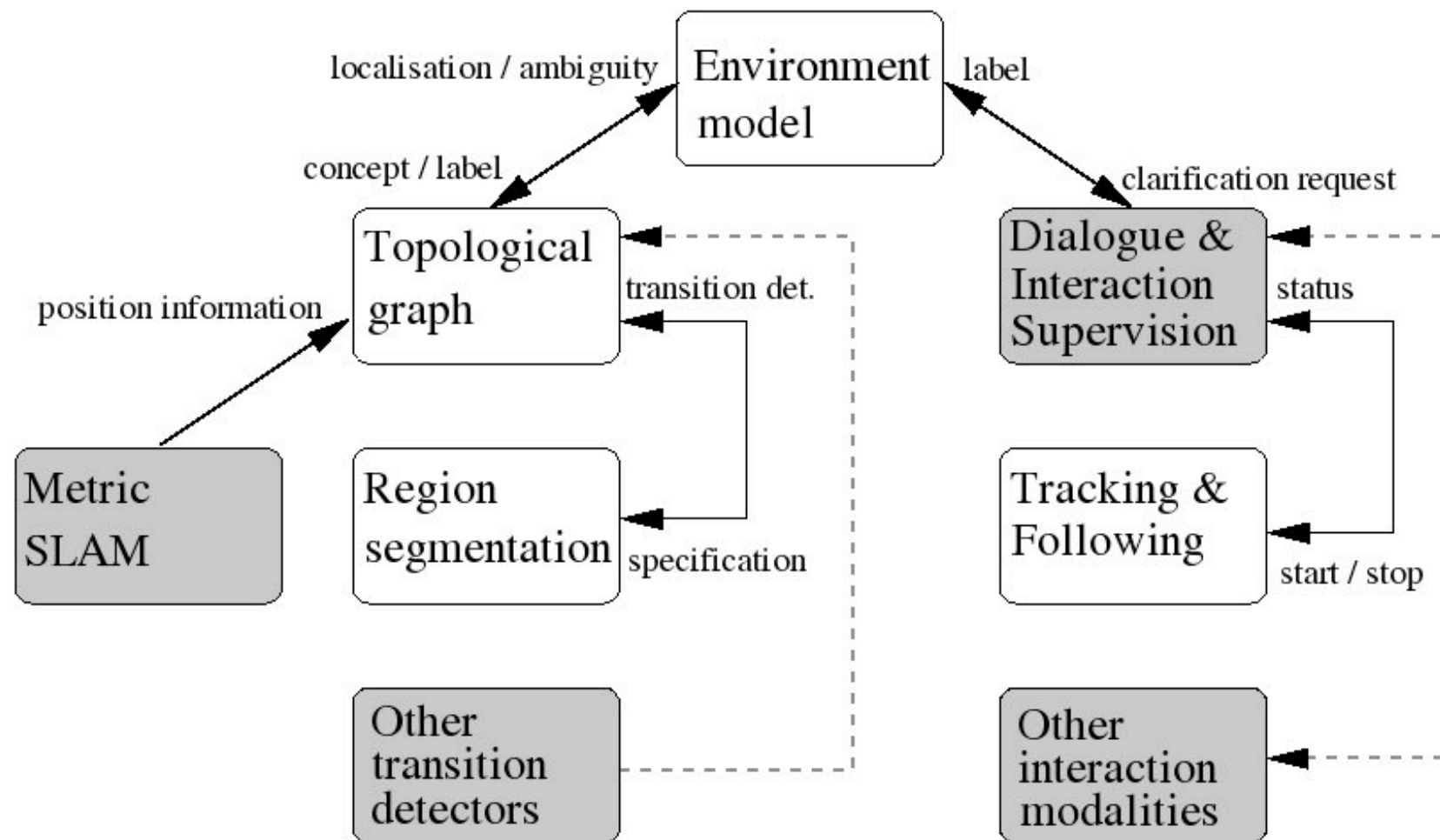
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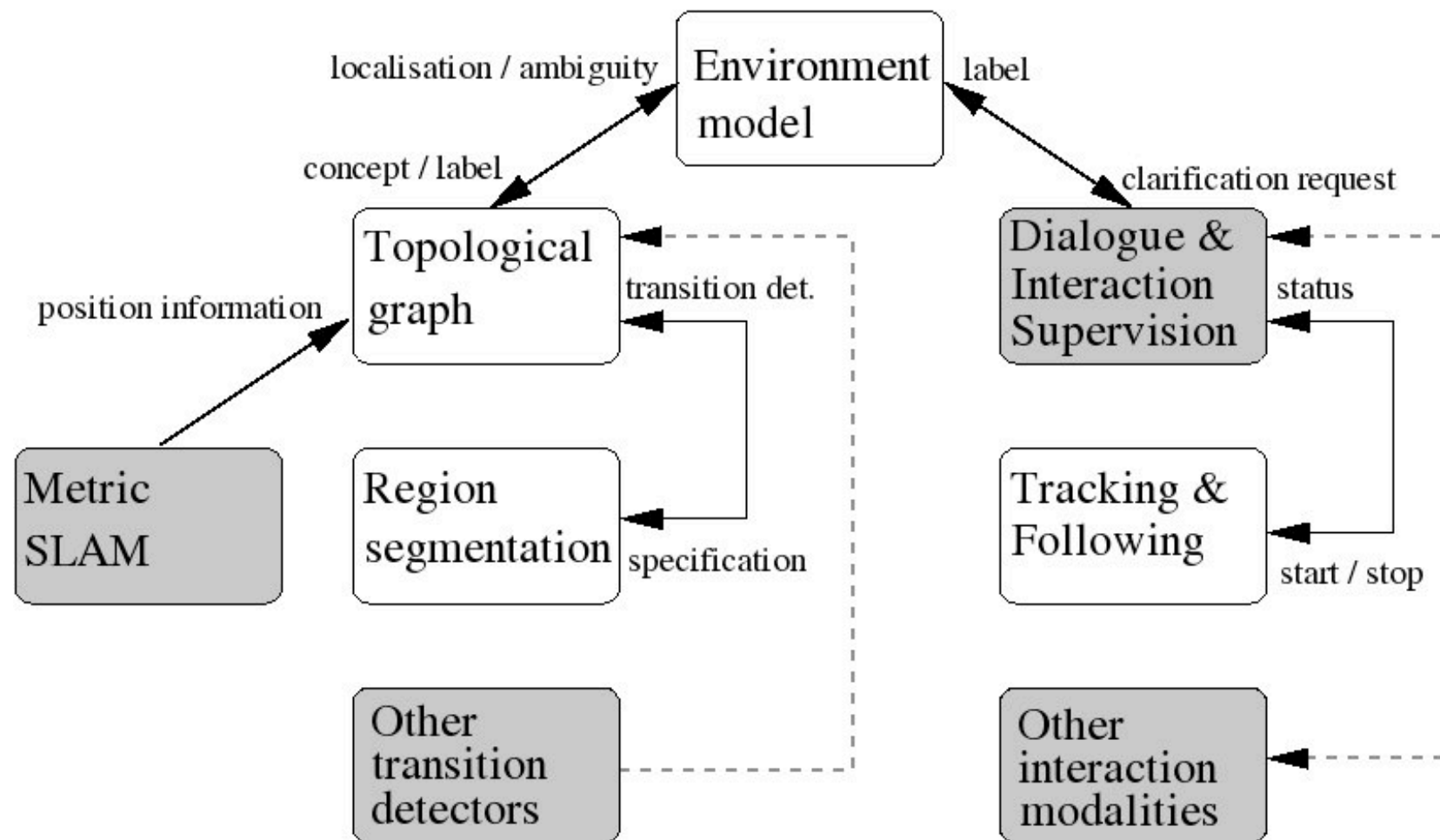
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# Human augmented mapping - overview

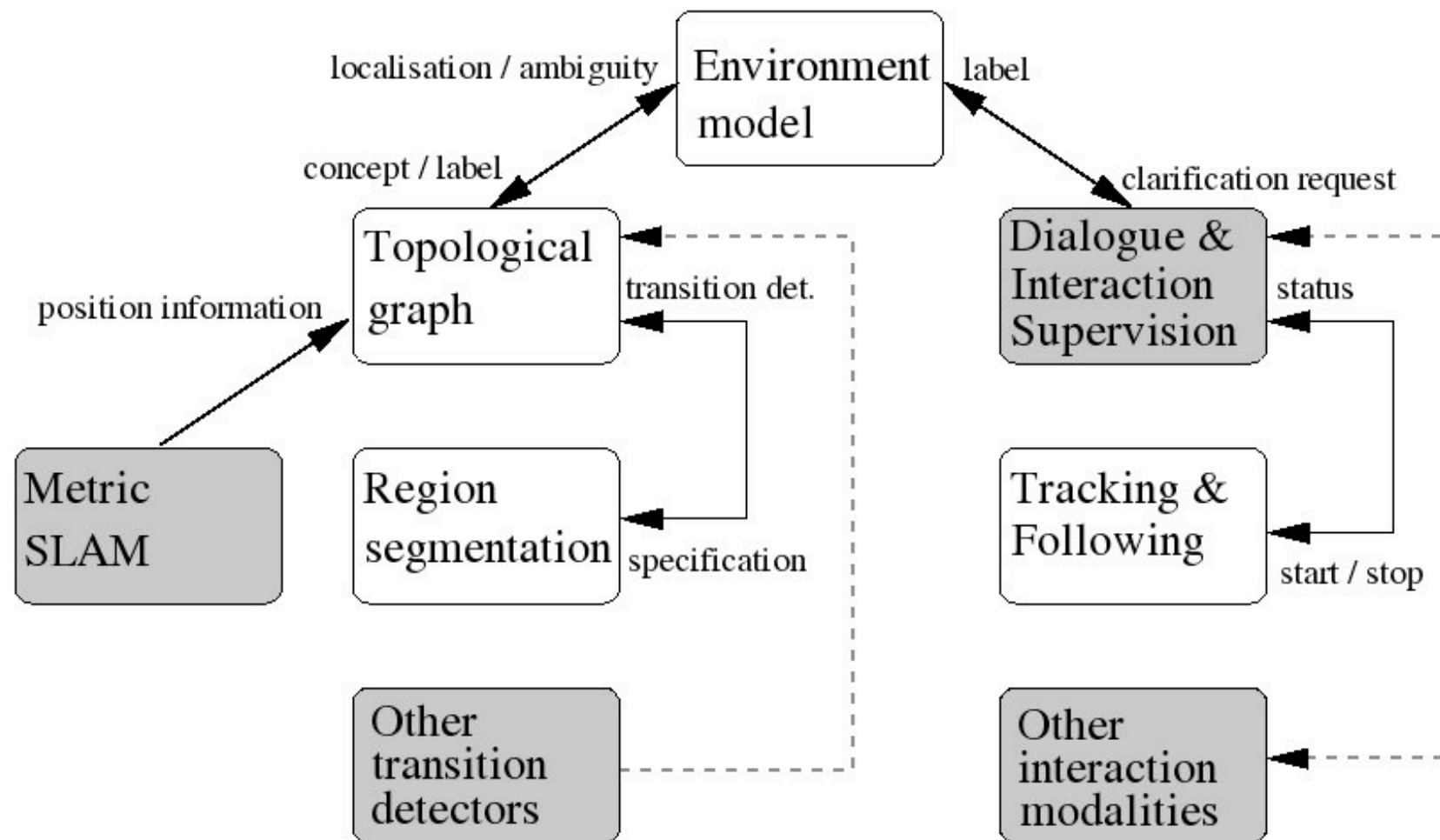


# Human augmented mapping - overview



Tracker “live” demo

# Human augmented mapping - overview

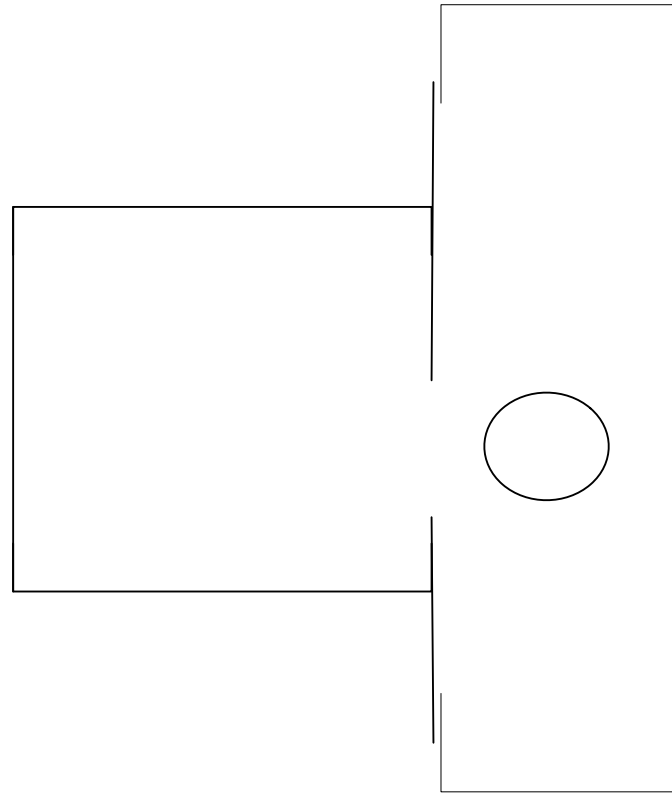


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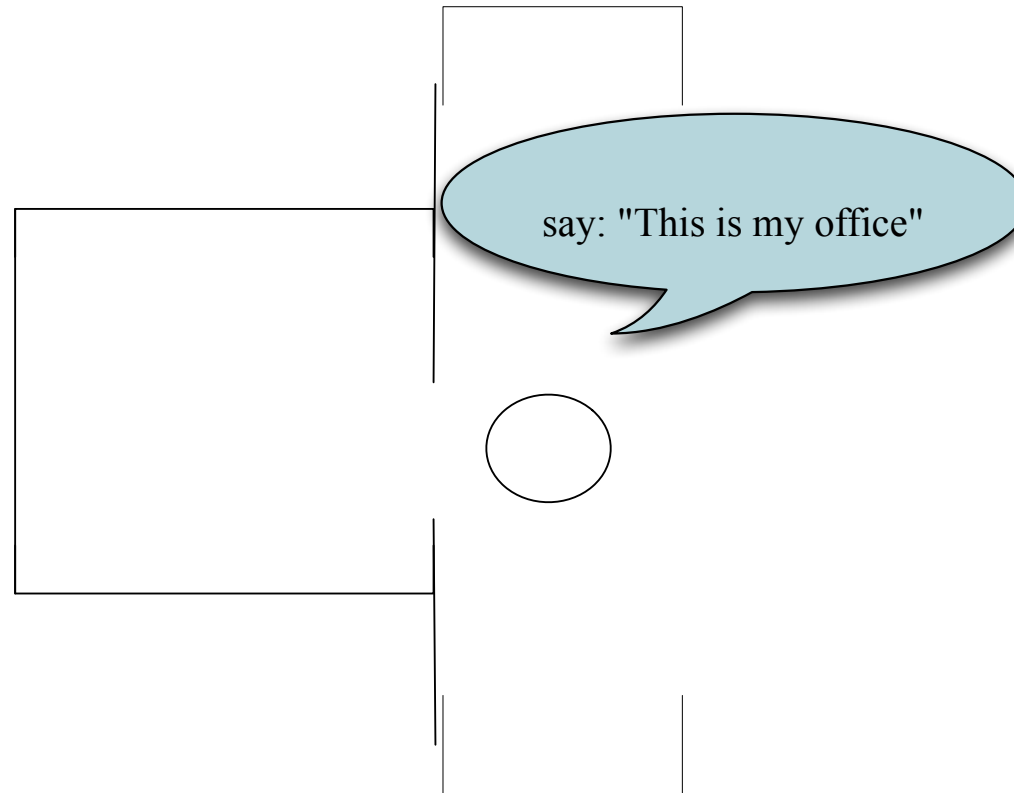
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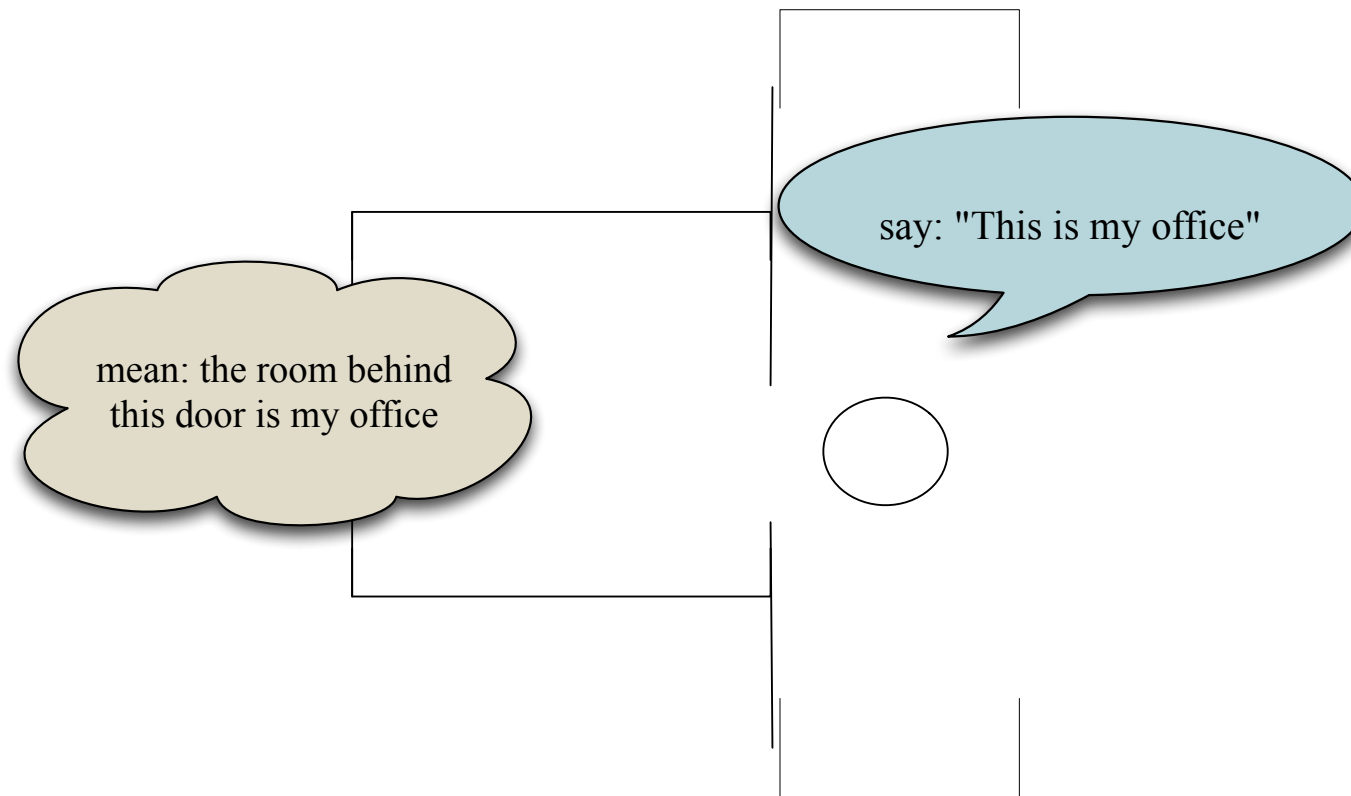
# What if...



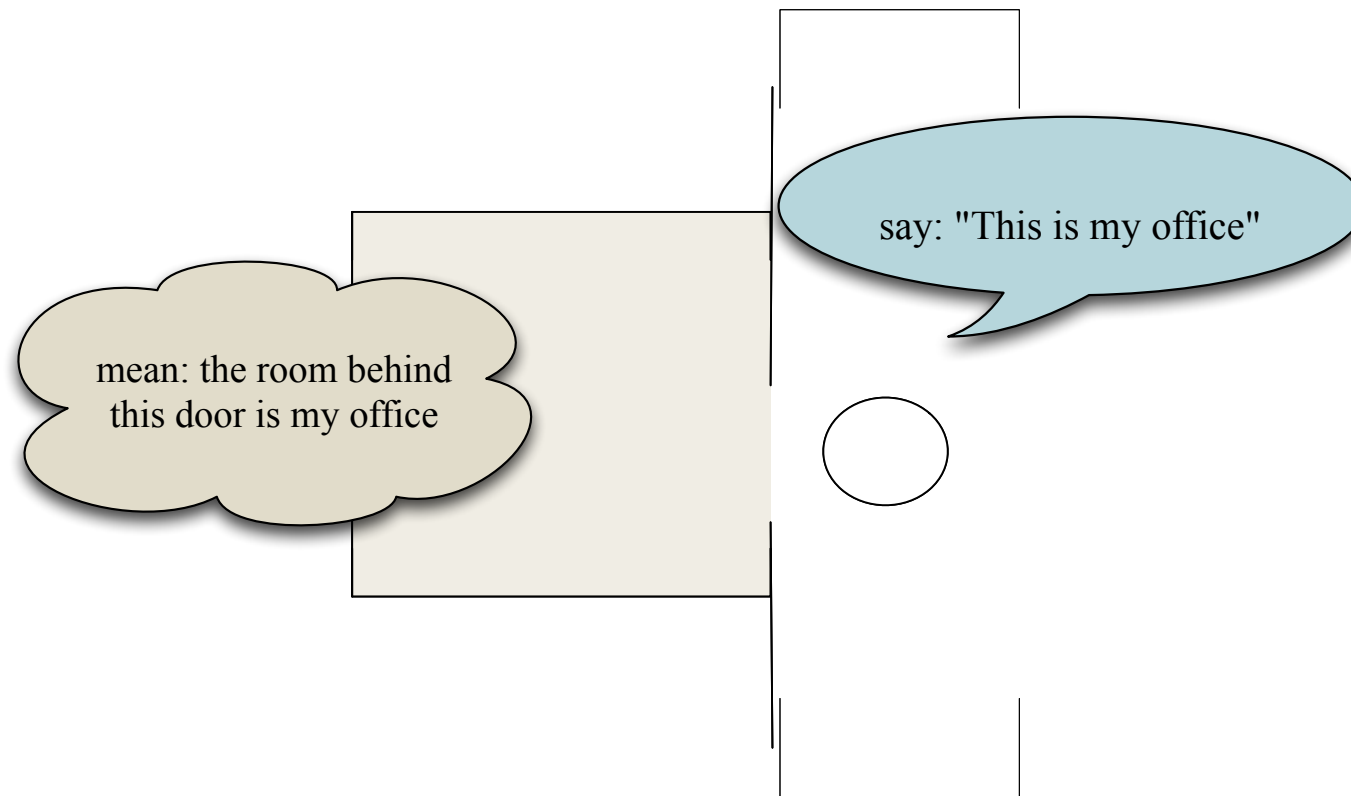
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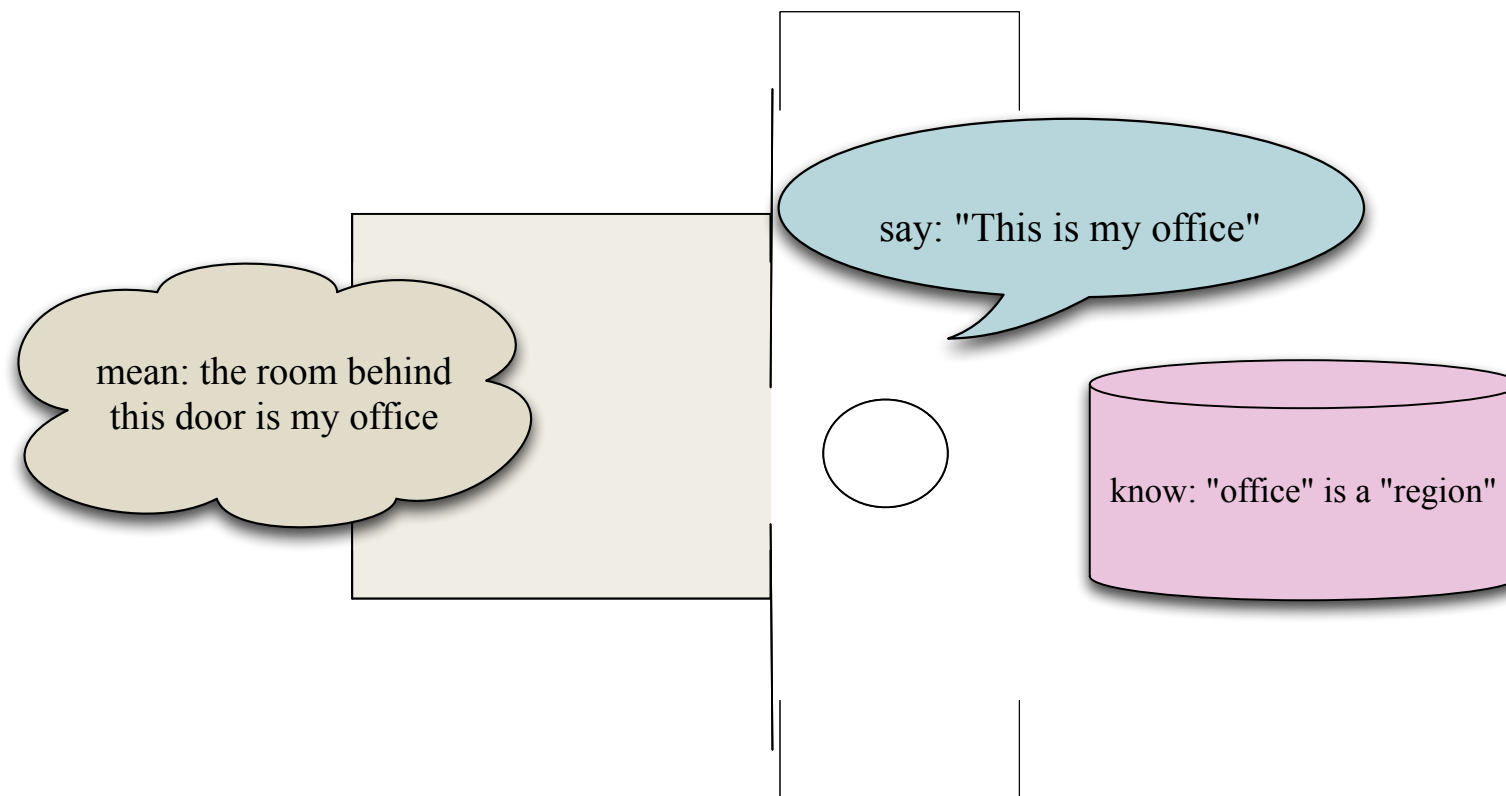


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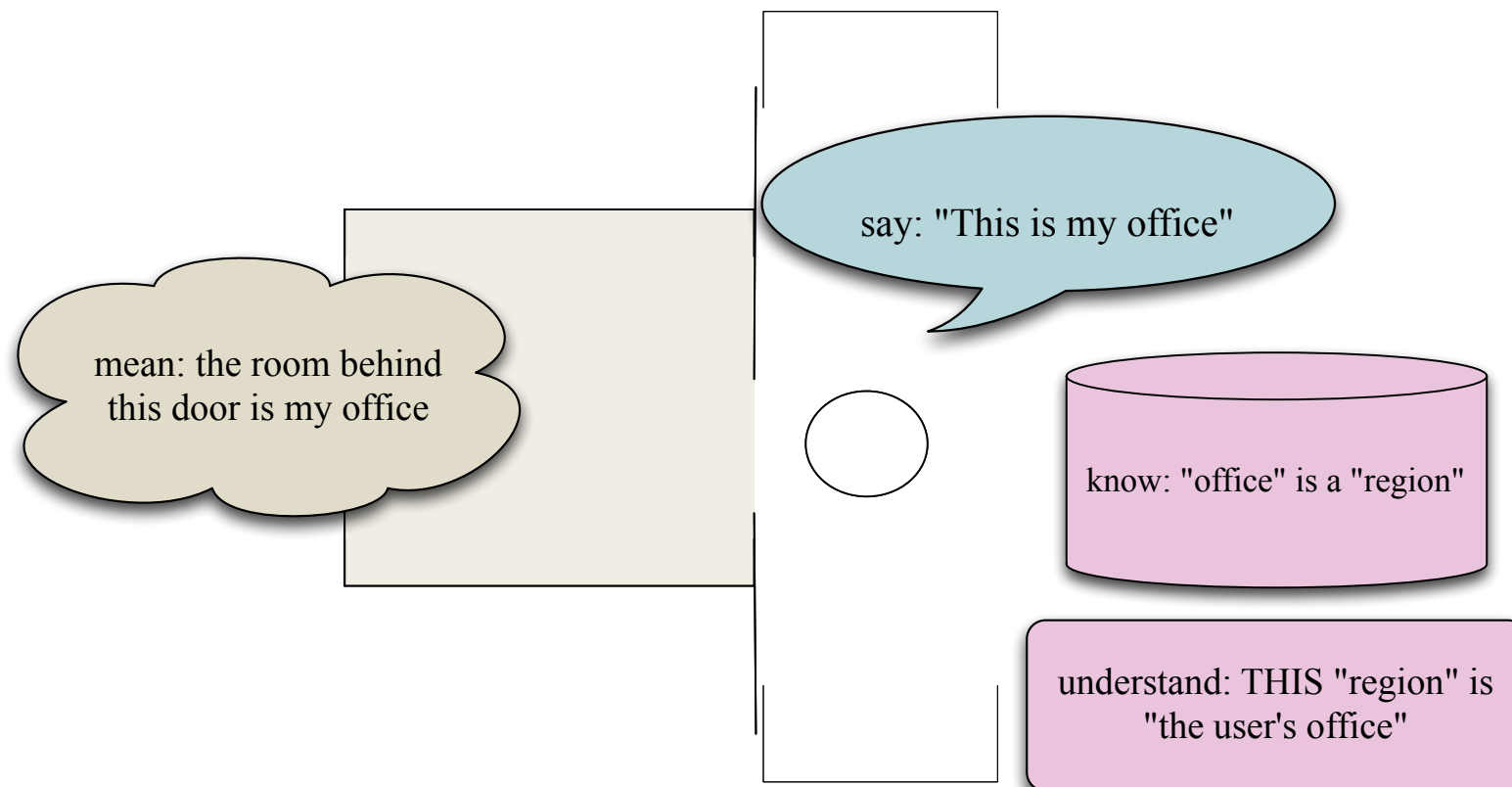




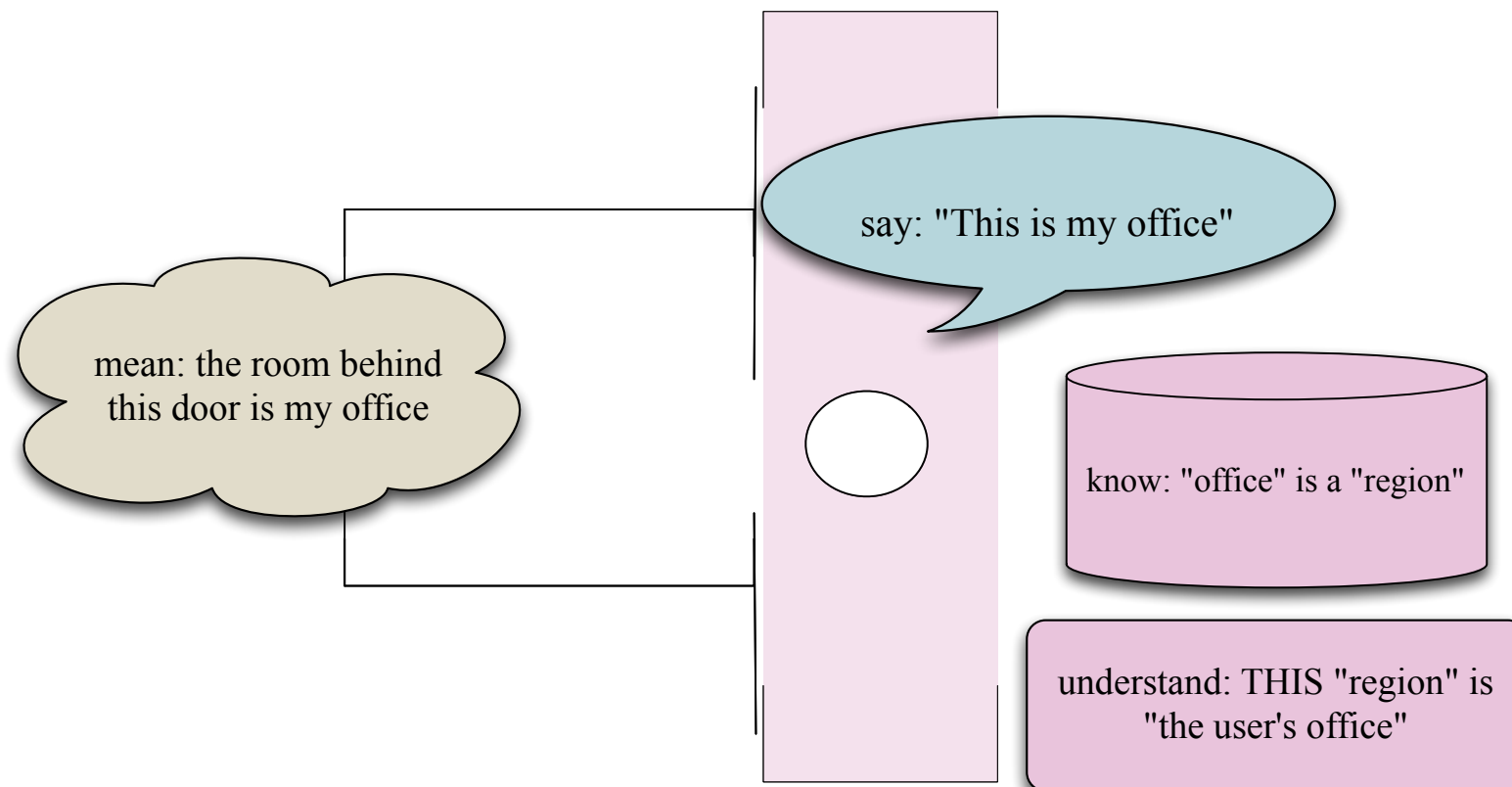
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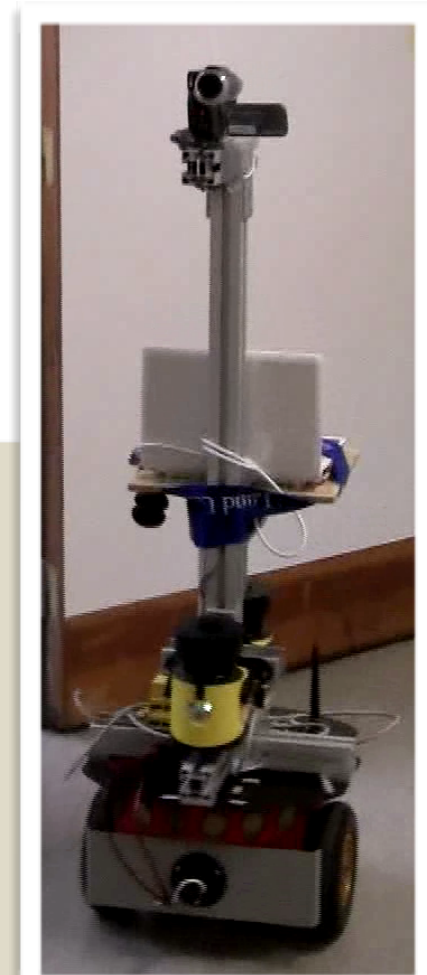
# Interaction patterns?

Can we repeatedly, with several subjects, in a clearly designed set-up, observe any structure, frequent strategies, “interaction patterns”, that correspond to the spatial categories *Region*, *Workspace*, and *Object* when people present an indoor environment to a mobile robot?

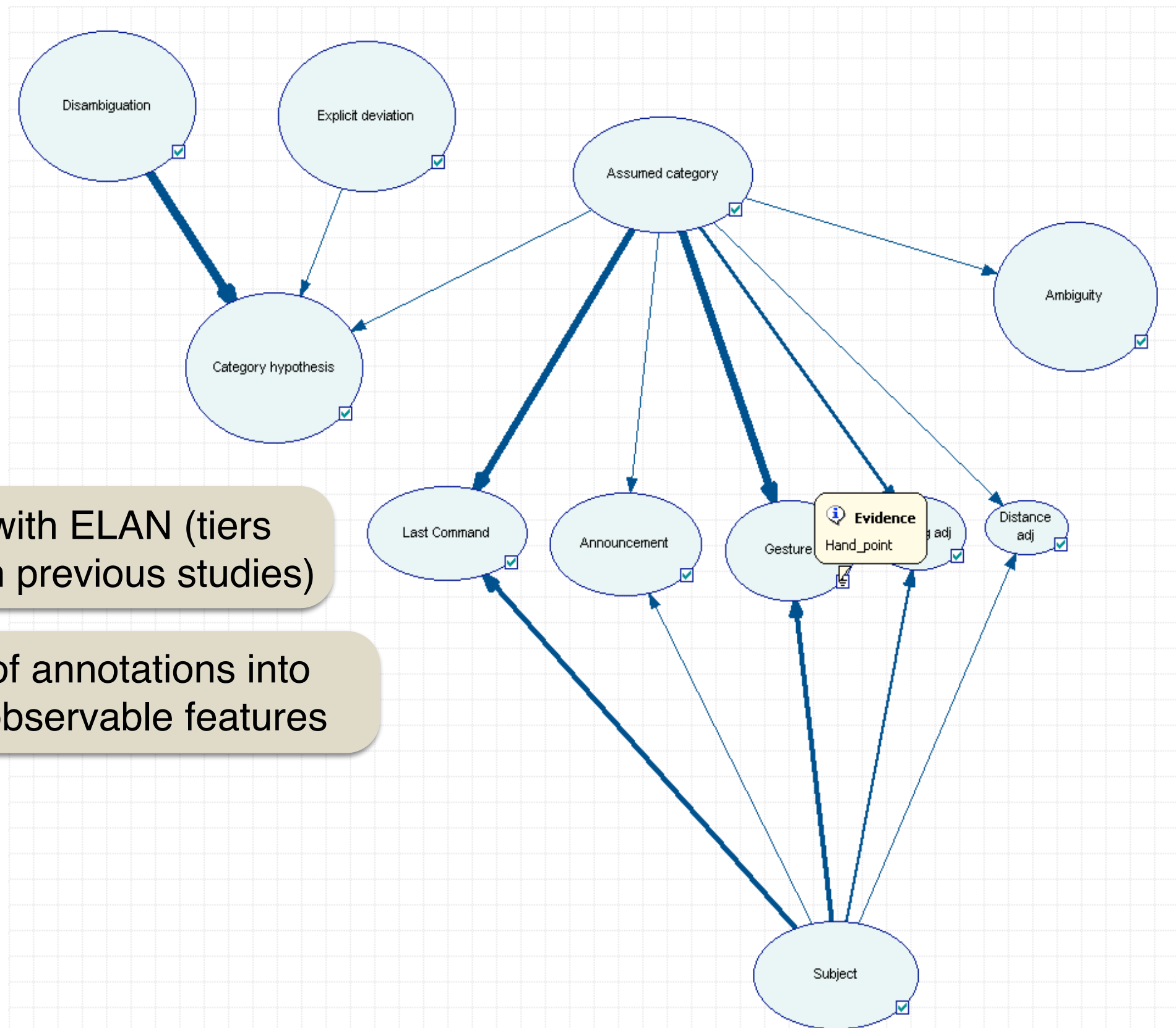
37 Participants

Guide the robot  
(three rooms/regions, at least  
three small objects and  
three locations/workspaces  
according to suggestion list)

Video (one external camera and  
one on the robot) and robot sensor  
data were stored for later analysis.



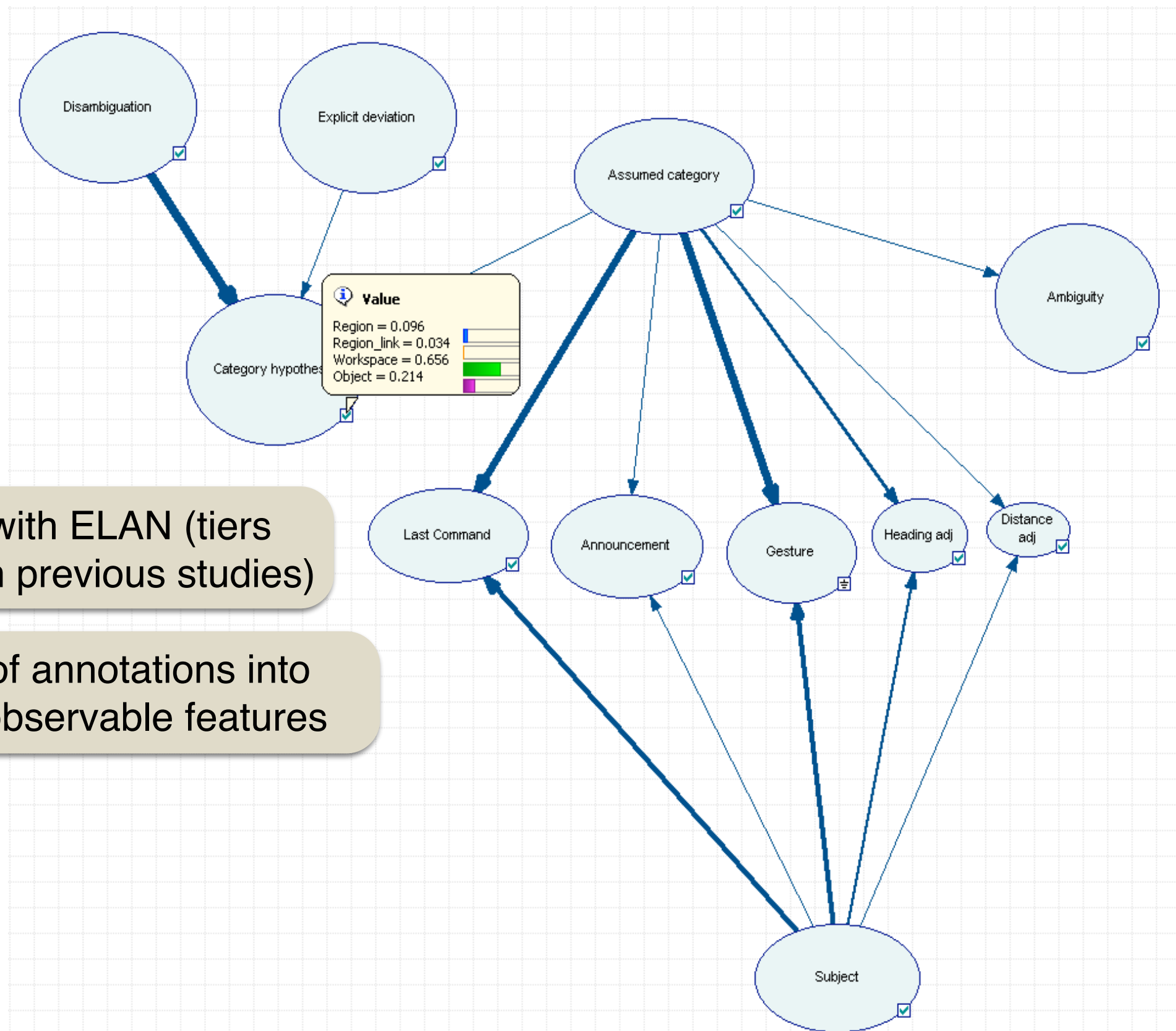
# Interaction patterns!



Annotation of videos with ELAN (tiers according to results from previous studies)

Manual summary of annotations into potentially system observable features

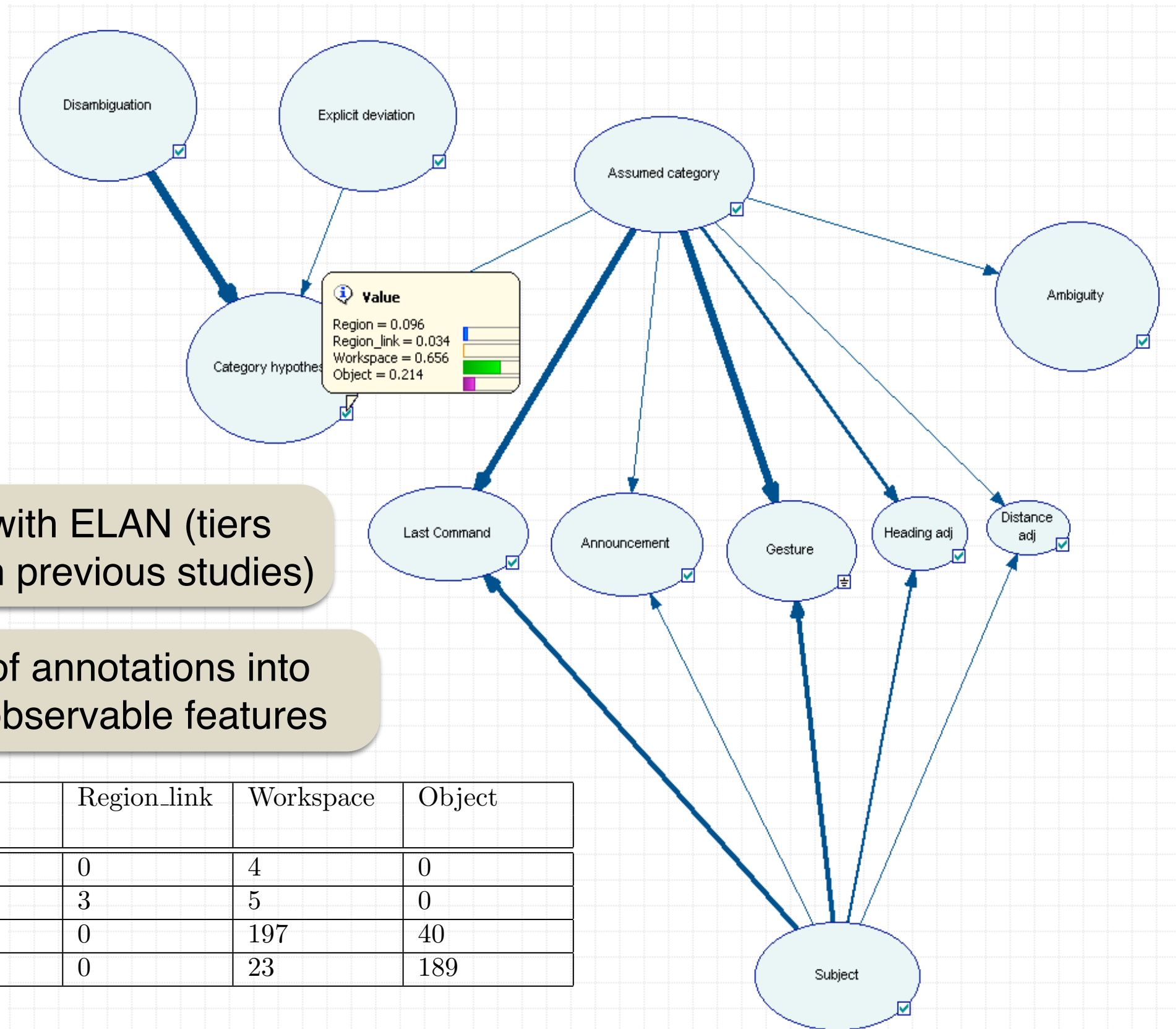
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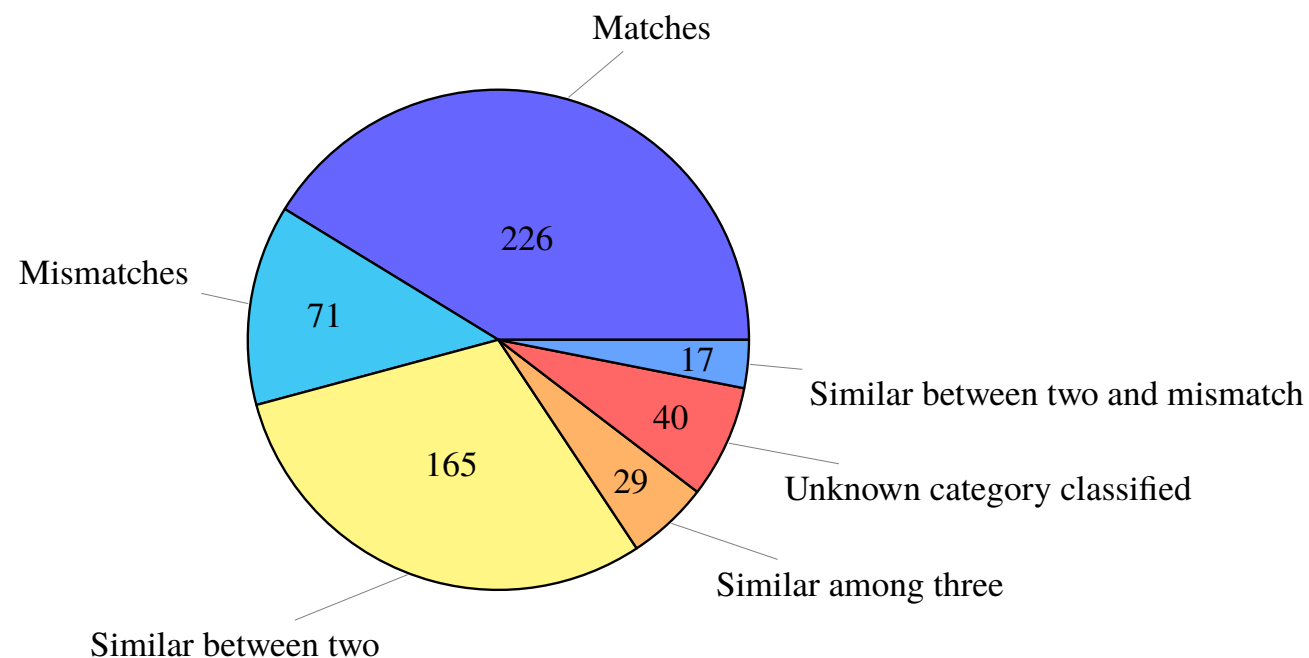
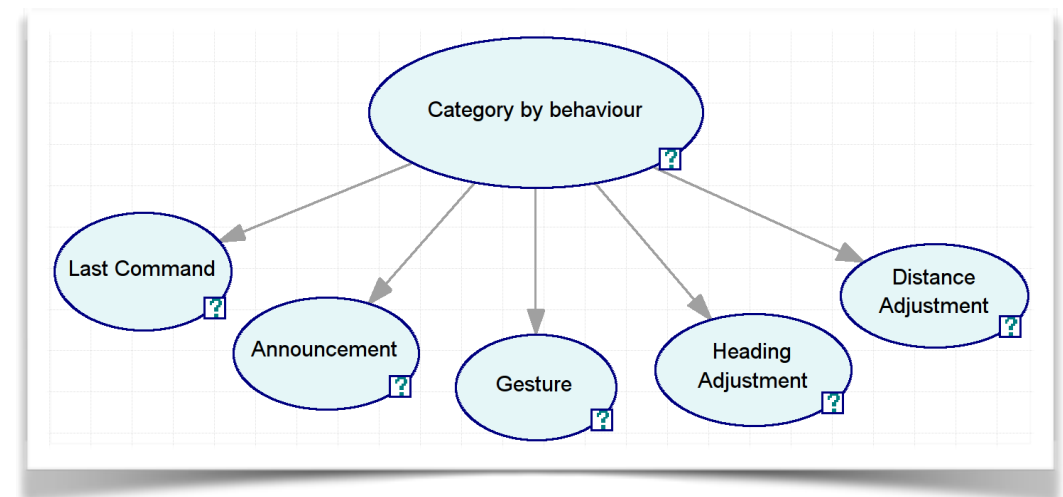
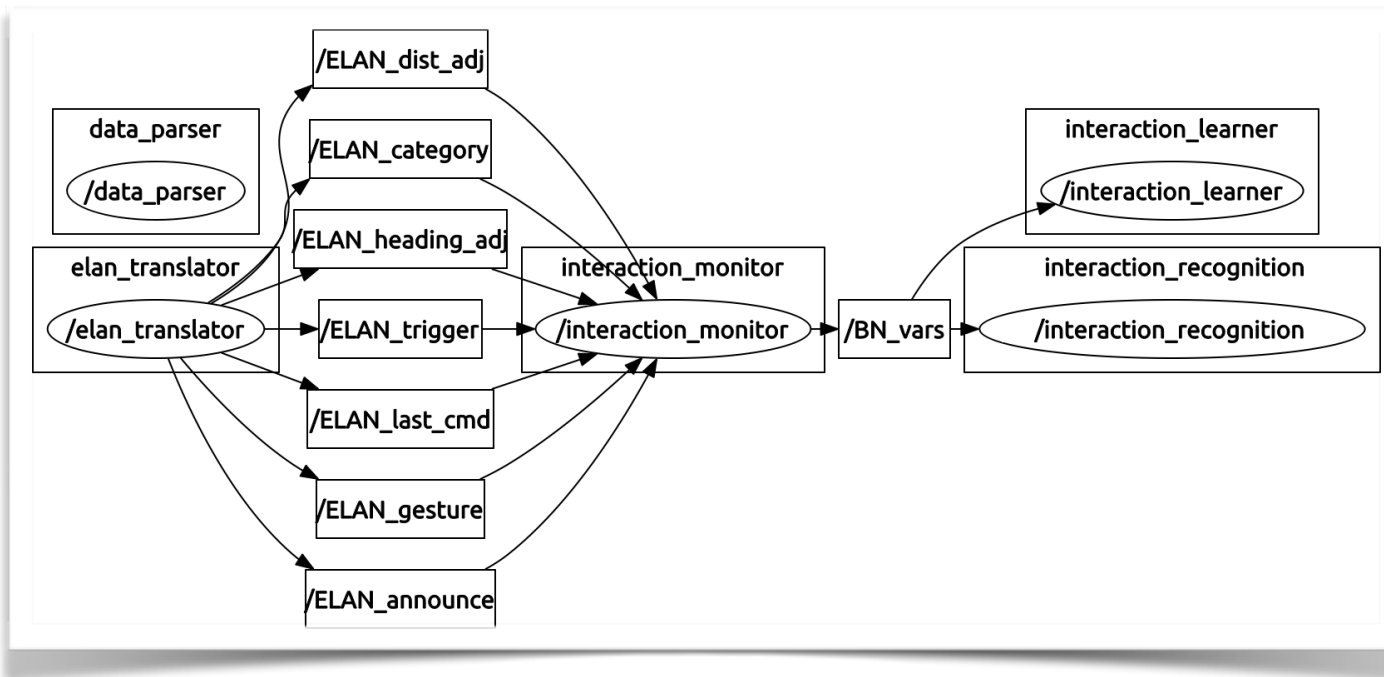
Annotation of videos with ELAN (tiers according to results from previous studies)

Manual summary of annotations into potentially system observable features

Prediction Definition	Region	Region_link	Workspace	Object
Region	62	0	4	0
Region_link	16	3	5	0
Workspace	5	0	197	40
Object	0	0	23	189



# Interaction patterns with probabilistic methods



71 clear mismatches:

40 *objects* -> *workspace*  
(mostly chairs)

17 *workspaces* -> *region*

6 *regions* -> *workspace*

(Felip Martí Carillo and Elin A. Topp,  
“Interaction and Task Patterns in Symbiotic, Mixed-Initiative Human-Robot Interaction”,  
AAAI-WIS on Symbiotic Cognitive Systems, February 2017, Phoenix, AZ, USA)



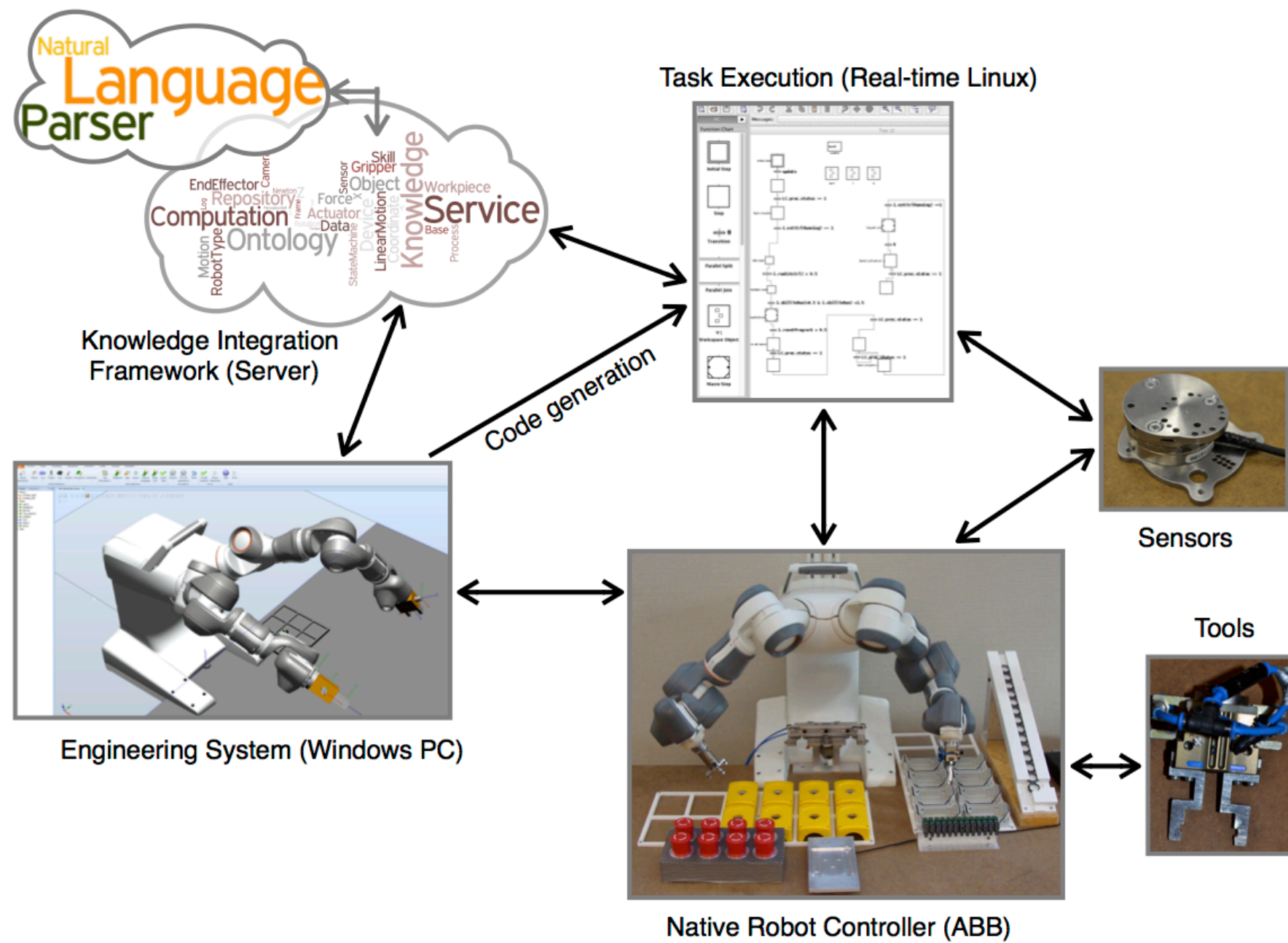
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# NLP-based programming

# The AI-bits behind...



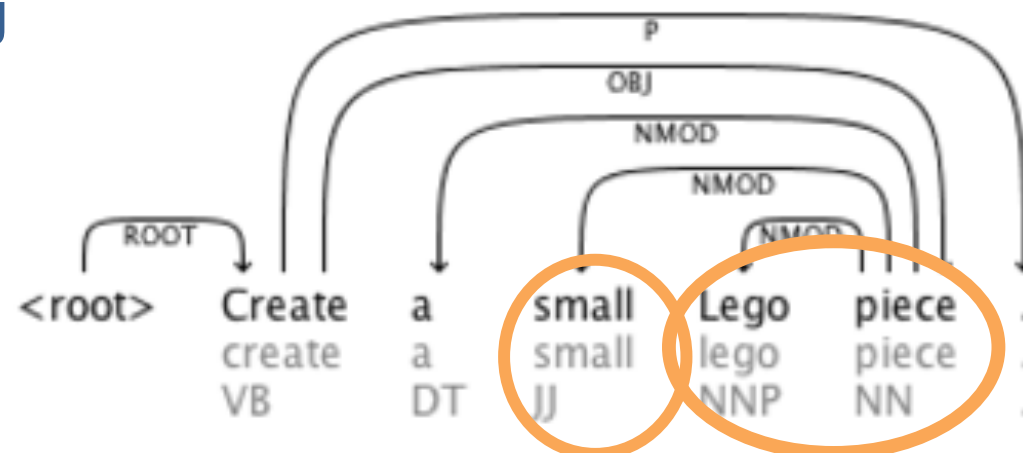
# NLP-based programming

	Create	a	small	Lego	piece	.
create.01		A1				

## Predicate-argument structures

	Create	a	small	Lego	piece	.
create.01		A1				

Map to existing  
commands or  
programs



# Skills and knowledge

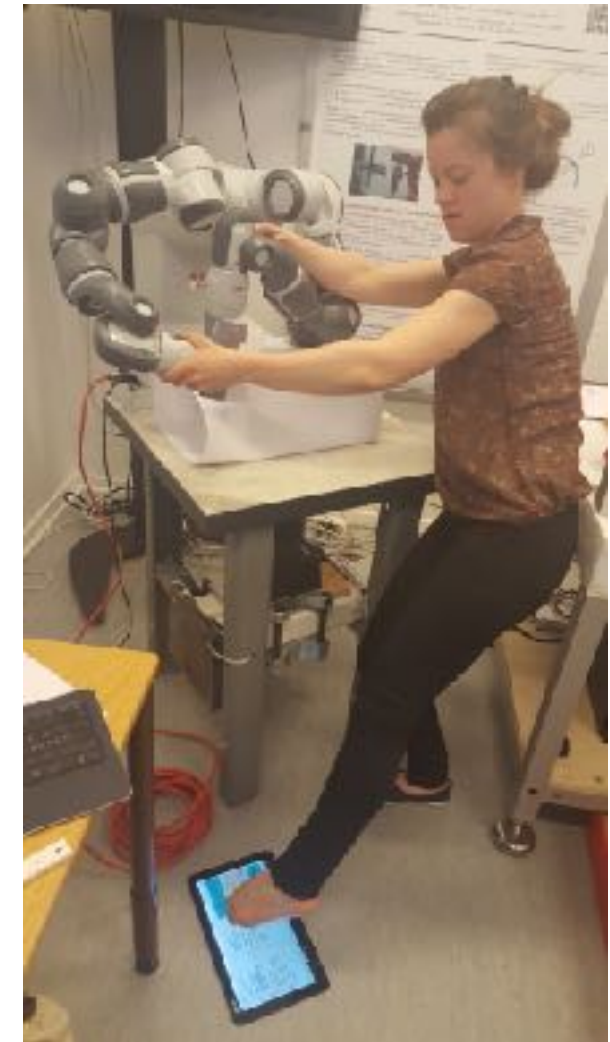
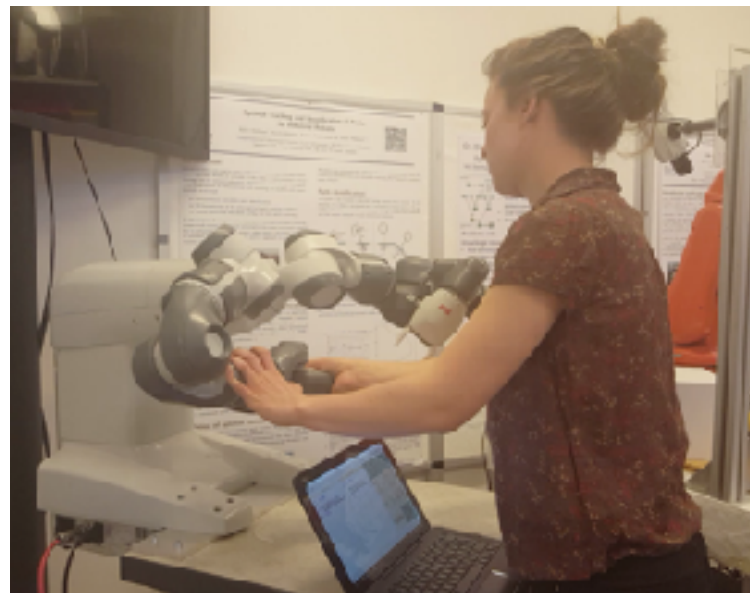
## Devices

- ▼ ● PhysicalObject
  - ▼ ● Device
    - ▼ ● Actuator
      - Motor
    - ▶ ● Communication
    - CommunicationPort
    - CompoundDevice
    - ▶ ● Computer
    - Controller
    - ▶ ● EnvironmentDevice
    - ▼ ● ManipulationAndHandlingDevice
      - ▶ ● Displacement
      - ▶ ● Fixture
      - ▶ ● Gripper
      - ▼ ● Robot
        - ArticulatedRobot
        - CartesianRobot
        - HexapodRobot
        - MobileRobot
        - ParallelKinematicRobot
        - ScaraRobot
        - SimpleKinematicRobot
        - SpecialKinematicRobot
      - ToolChanger

## Skill types

- ▼ ● Skill
  - ▶ ● AdditionalFunction
  - ▶ ● DiagnosticFunction
  - ▼ ● MainFunction
    - ▶ ● LightingFunction
    - ▼ ● ManipulationAndHandlingFunction
      - ▶ ● Move
      - ▼ ● Secure
        - Attach
        - ChangeTool
        - Clamp
        - Detach
        - ▶ ● Grasp
        - ▶ ● Release
        - Unclamp
    - ▶ ● ManufacturingFunction
    - ▼ ● OpticFunction
      - AcquireImage
      - Focalize
    - ▼ ● Processing
      - ProcessImages
    - ▶ ● SensorFunction

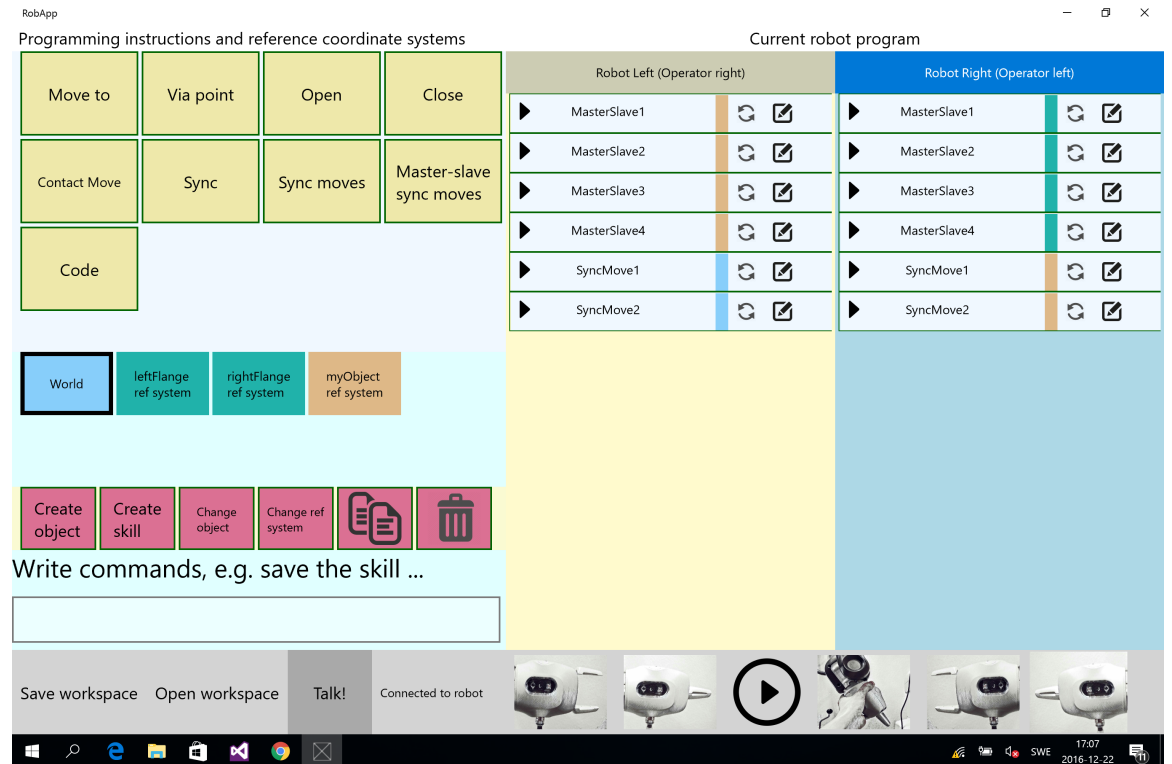
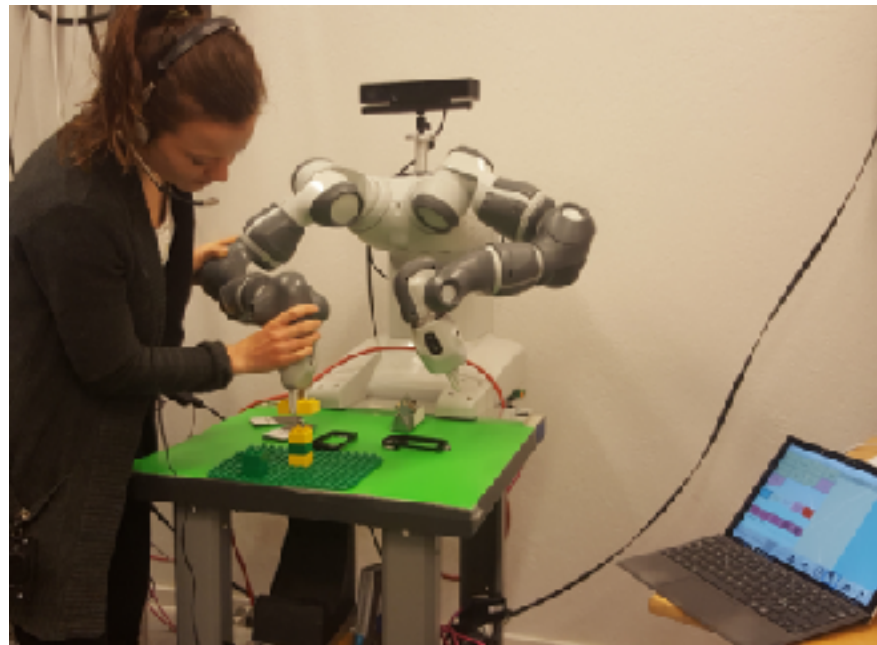
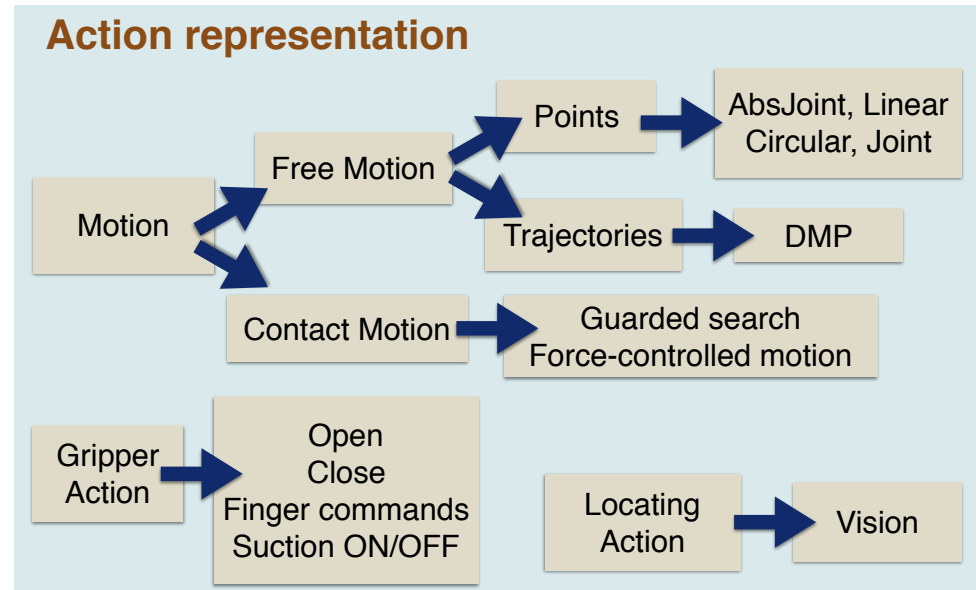
# However ...



Even though the robot has lead-through built in, and even though we could use NLP and high-level instructions to make use of our skill representation -



# ... we must get the skills into the system!

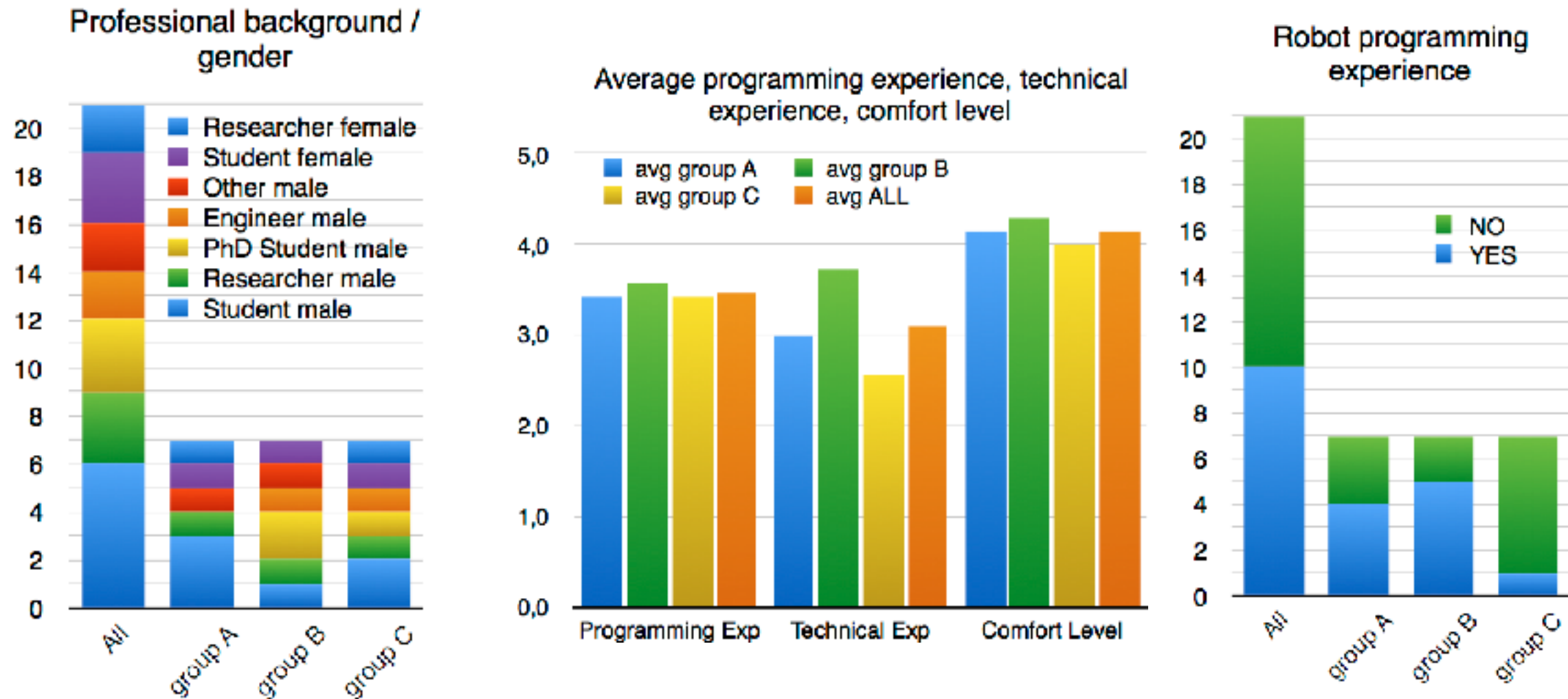


(Maj Stenmark, Mathias Haage, Elin A.Topp, and Jacek Malec,  
“Supporting Semantic Capture during Kinesthetic Teaching of Collaborative Industrial Robots”,  
ICSC-IW on Semantics in Engineering and Robotics, January 2017, San Diego, CA, USA)

(Maj Stenmark, Mathias Haage, Elin A.Topp, and Jacek Malec,  
“Making Robotic Sense of Incomplete Human Instructions in High-Level Programming for Industrial Robotic Assembly”,  
AAAI-WWS on Human-Machine Collaborative Learning, February 2017, San Francisco, CA, USA)

# Does skill re-use help?

## Can non-experts program the robot?



Two phases:

I: Step I (create “pick up and insert a 2x2 Duplo on another one” - skill) and  
 II: Steps 2-4 “repeat” Step I (different conditions) with a 2x4 Duplo

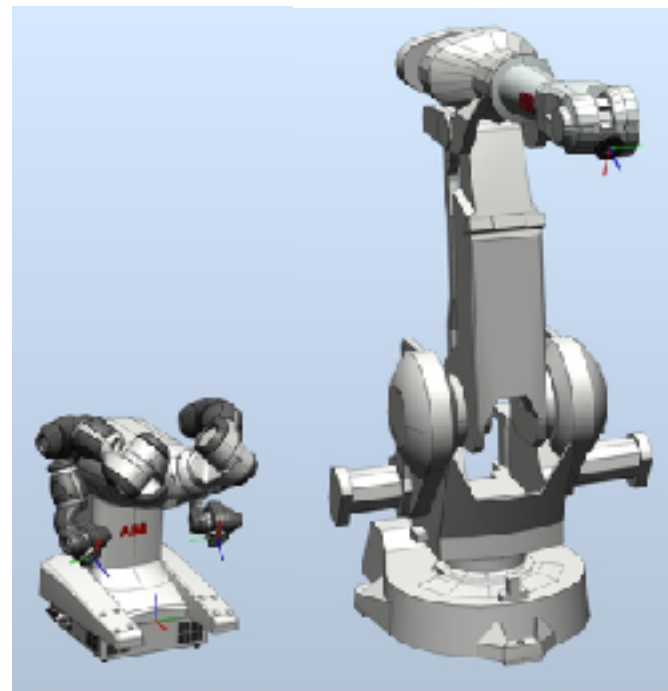
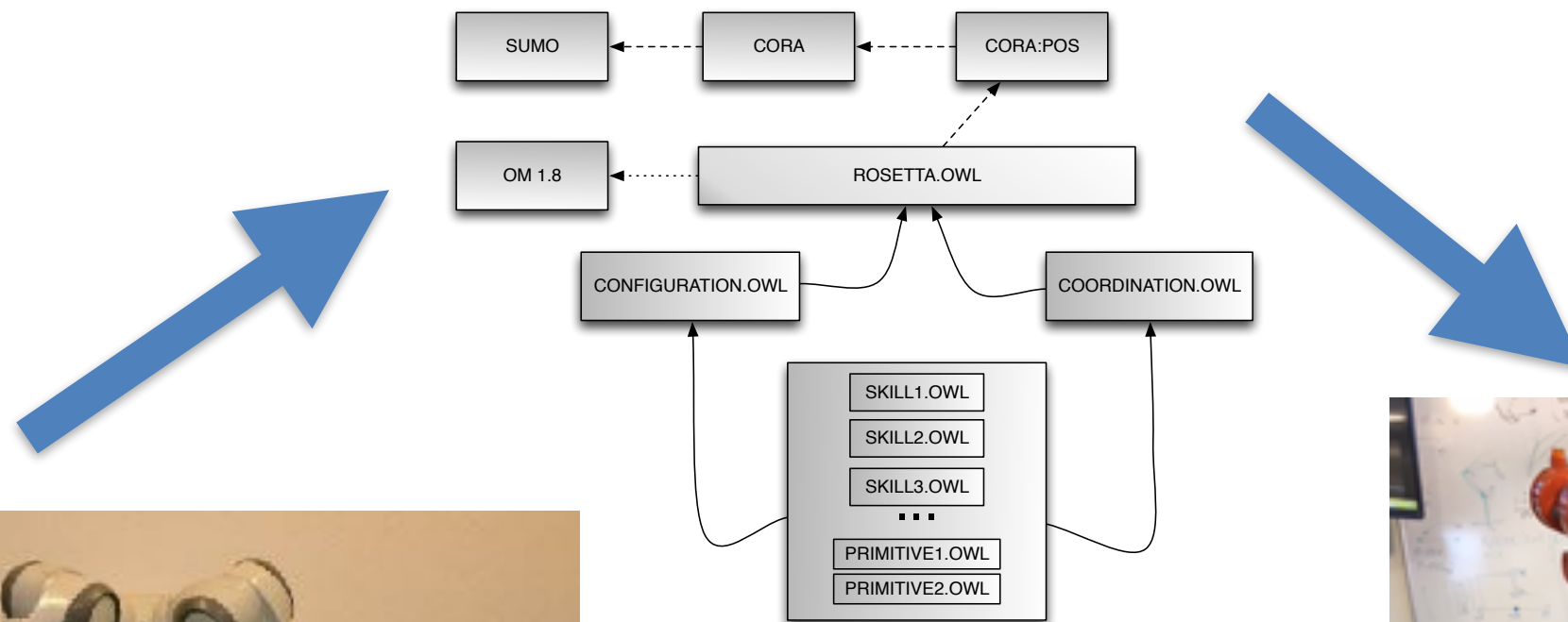
Three Conditions:

A: re-use your step I skill  
 B: re-use a provided, expert-made skill  
 C: build everything from scratch



# Yes! and Yes!

# Program here - run there...



# Programming on YuMi

RobApp\_DEMO

Programming instructions and reference coordinate systems

Move to	Via point	Open	Close
Code	Contact Move	Fingers	Sync
Sync moves	Master-slave sync moves		

Joint values   robotbase   leftFlange   rightFlange   Pos1

Pos2

Create object	Create skill	Import skill	Change object	Change ref system
			Go Home	

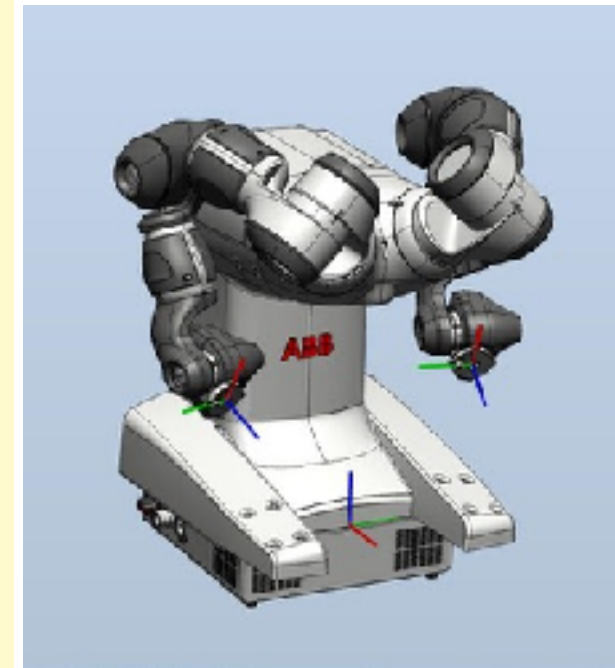
Write commands, e.g. save the skill ...   Talk!

Save workspace   Open workspace   New workspace   Robot IP: 127.0.0.1   Connected

Current robot program

Robot Right (Operator left)	Robot Left (Operator right)
Move1	
Move2	

15:59 2018-03-08



# Re-using the skill on IRB2400

RobApp\_DEMO

307 301

Programming instructions and reference coordinate systems

Move to Via point Open Close

Code MovesWObj

Joint values robotbase

Create object Create skill Import skill Change object Change ref system

Write commands, e.g. save the skill ... Talk!

Save workspace Open workspace New workspace Robot IP: 127.0.0.1 Connected

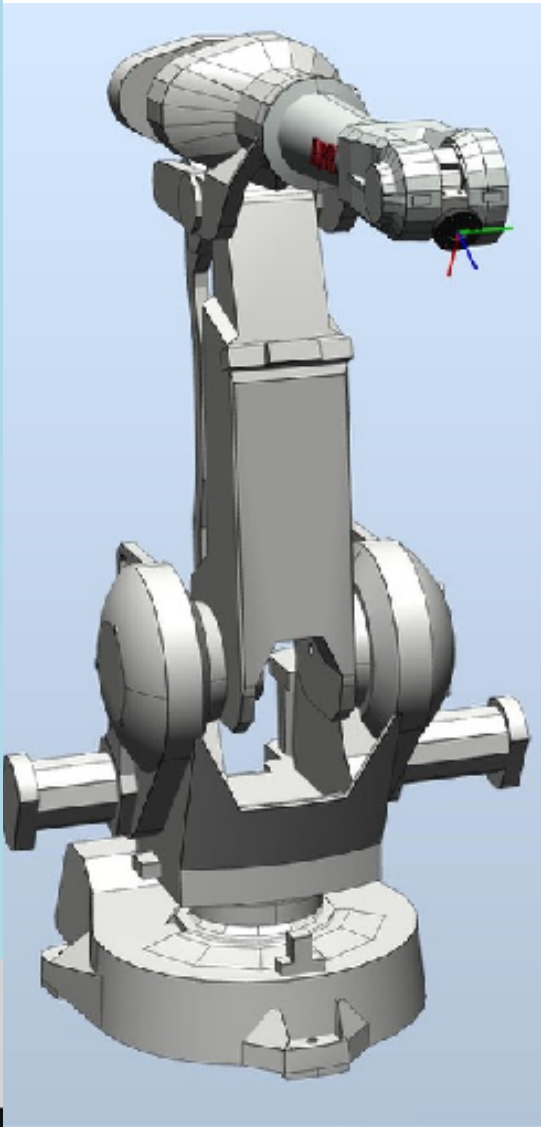
Current robot program

T\_ROB1

Warning

This skill uses a world object called "Pos2" which does not exist in the current workspace!

Close



16:07 2018-03-09

The image shows a screenshot of the RobApp\_DEMO software interface. The interface is divided into several sections. On the left, there is a 'Programming instructions and reference coordinate systems' panel with buttons for 'Move to', 'Via point', 'Open', 'Close', 'Code', 'MovesWObj', 'Joint values', and 'robotbase'. Below this is a 'Create object', 'Create skill', 'Import skill', 'Change object', 'Change ref system', and 'Go Home' section. At the bottom left, there is a 'Write commands, e.g. save the skill ...' section with a 'Talk!' button. The bottom of the interface features a status bar with 'Save workspace', 'Open workspace', 'New workspace', 'Robot IP: 127.0.0.1', and a 'Connected' status. On the right, the 'Current robot program' section shows 'T\_ROB1'. A central warning dialog box is displayed, stating: 'Warning: This skill uses a world object called "Pos2" which does not exist in the current workspace!'. To the right of the software window is a 3D model of an IRB2400 industrial robot arm. The Windows taskbar at the bottom shows the time as 16:07 on 2018-03-09.

# Re-using the skill on IRB2400

RobApp\_DEMO

010 015

Programming instructions and reference coordinate systems

Move to Via point Open Close

Code MovesWObj

Joint values robotbase Pos1 Pos2

Create object Create skill Import skill Change object Change ref system

Write commands, e.g. save the skill ... Talk!

Save workspace Open workspace New workspace Robot IP: 127.0.0.1 Connected

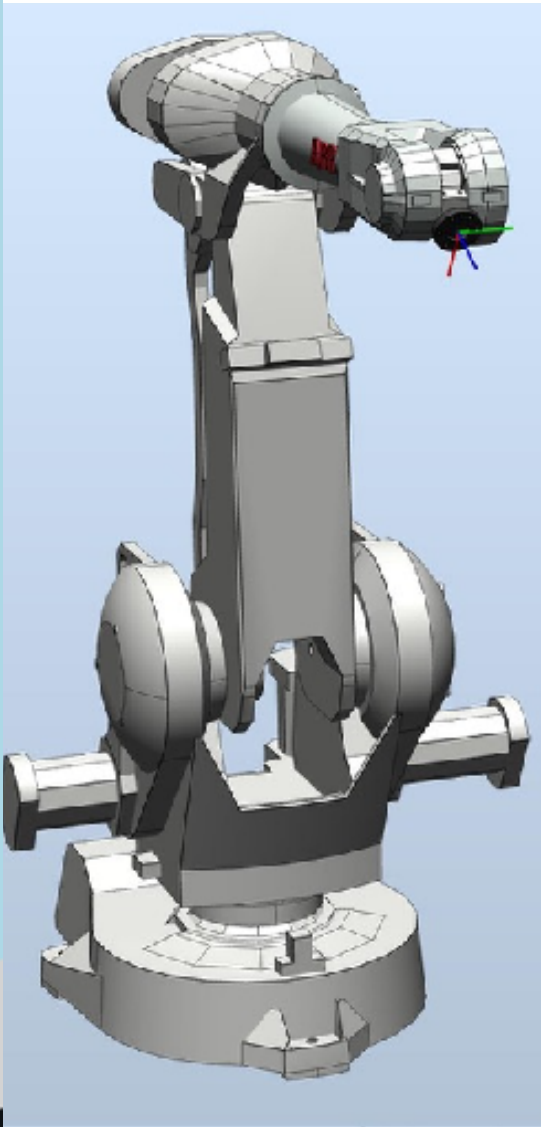
Current robot program

T ROB1

MoverWObj

Move1

Move2



15:11 2016-02-09

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# Sensorimotor policies (RL)

“Image in - action sequence out”

Sensorimotor robot policy training using Reinforcement Learning

Ali Ghadirzadeh, KTH, PhD Thesis 2018.

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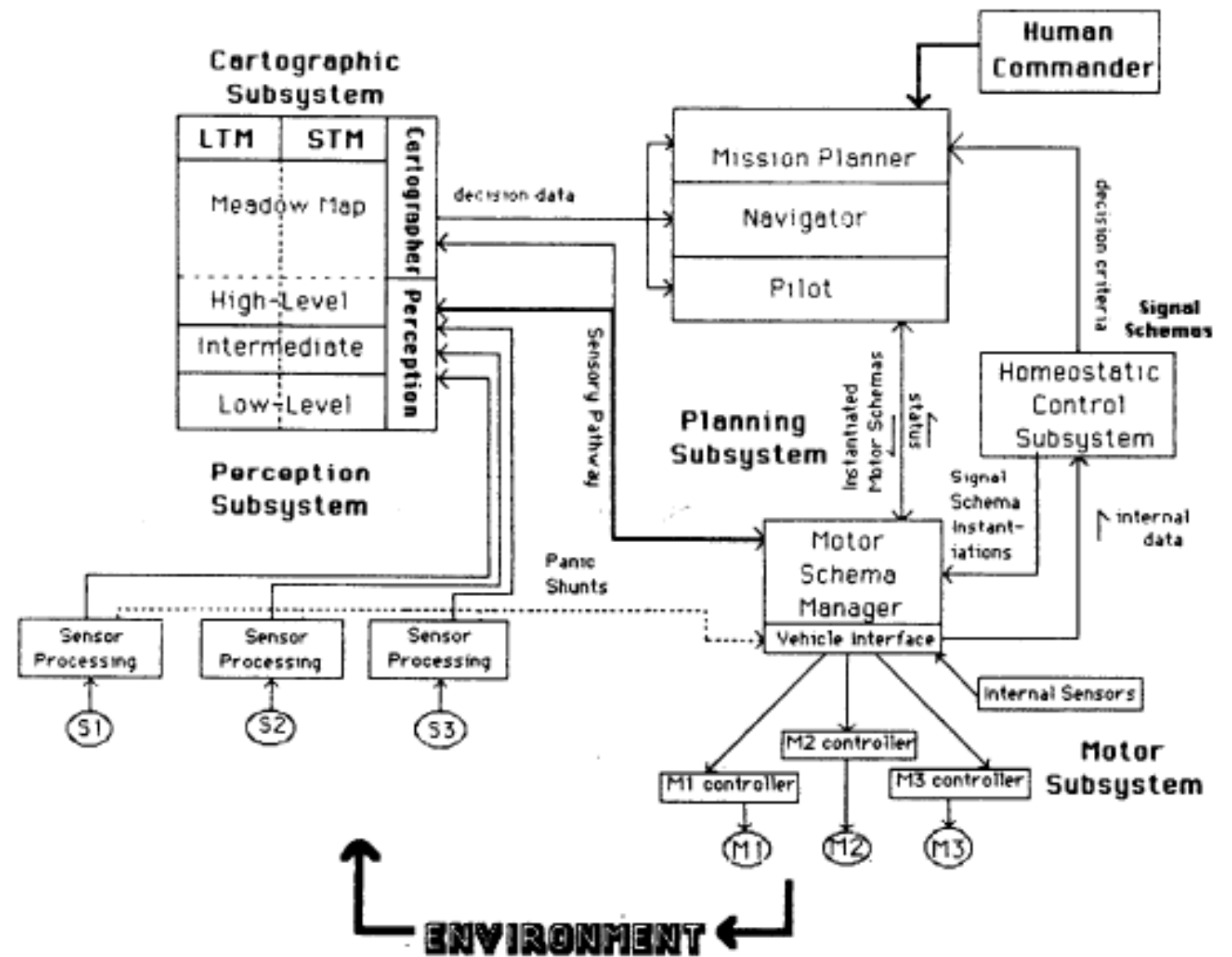


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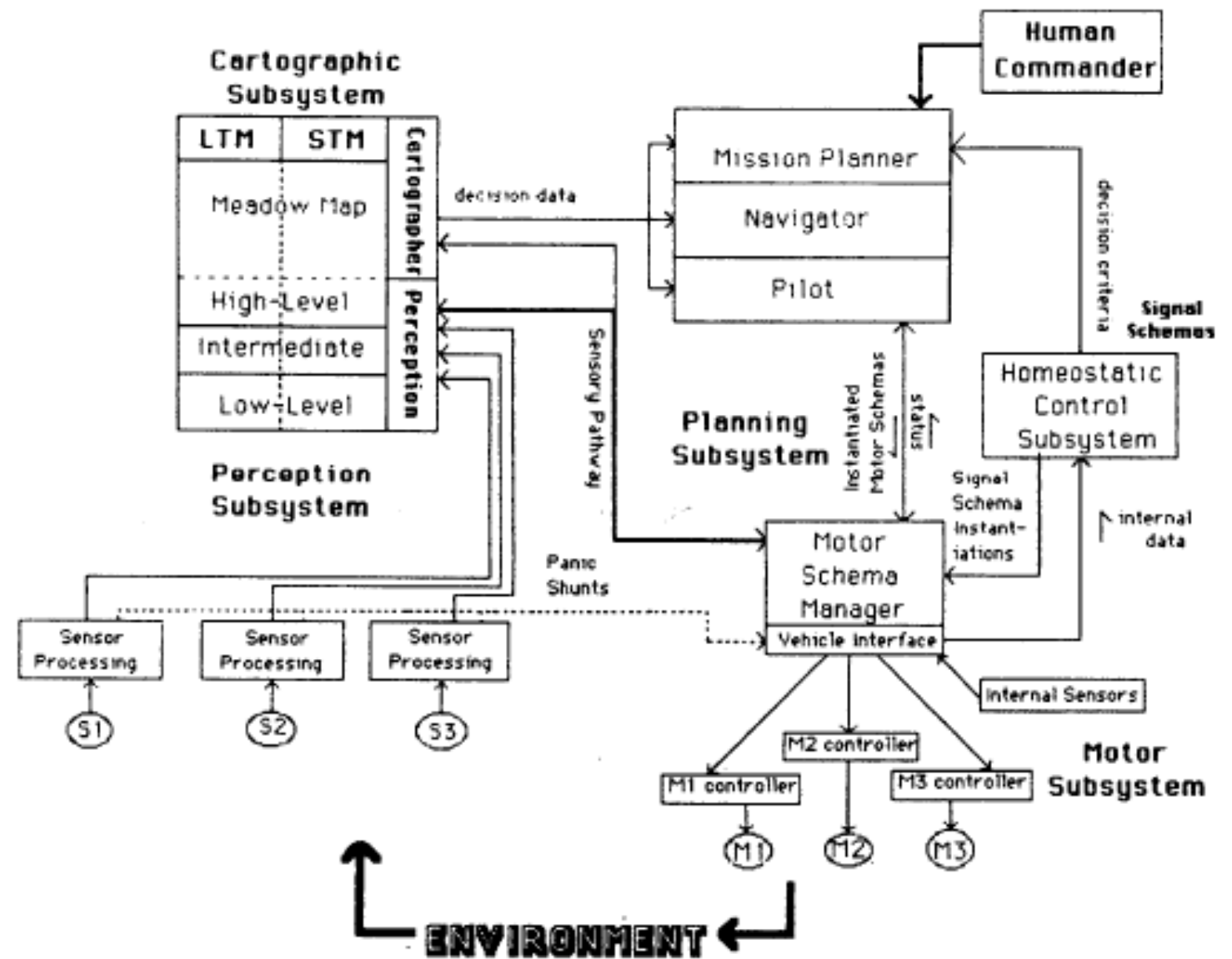
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- What if something goes wrong with one part of the plan? Does this affect the whole task execution, or only one of the robots?

# Deliberation in, e.g. a navigation system



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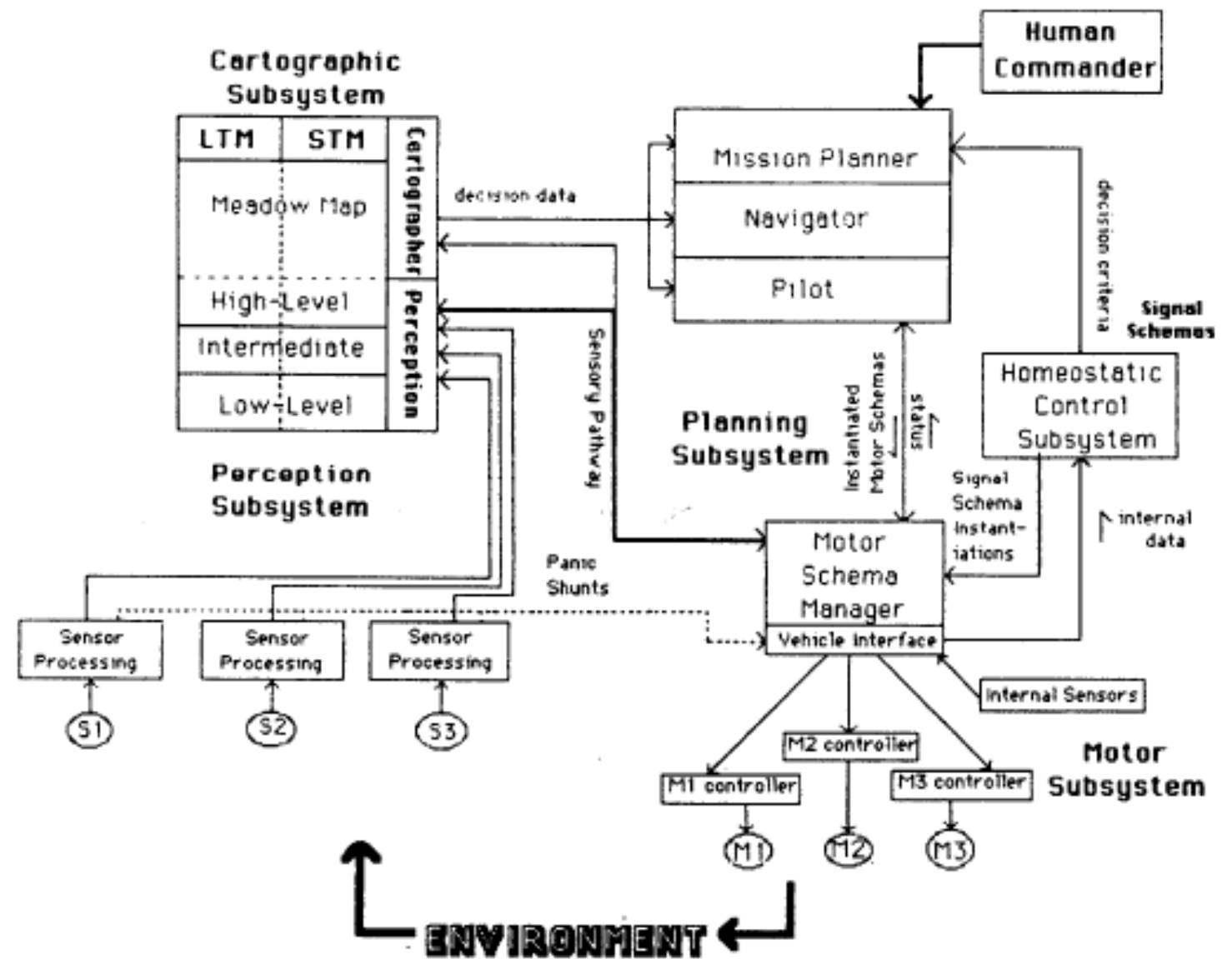
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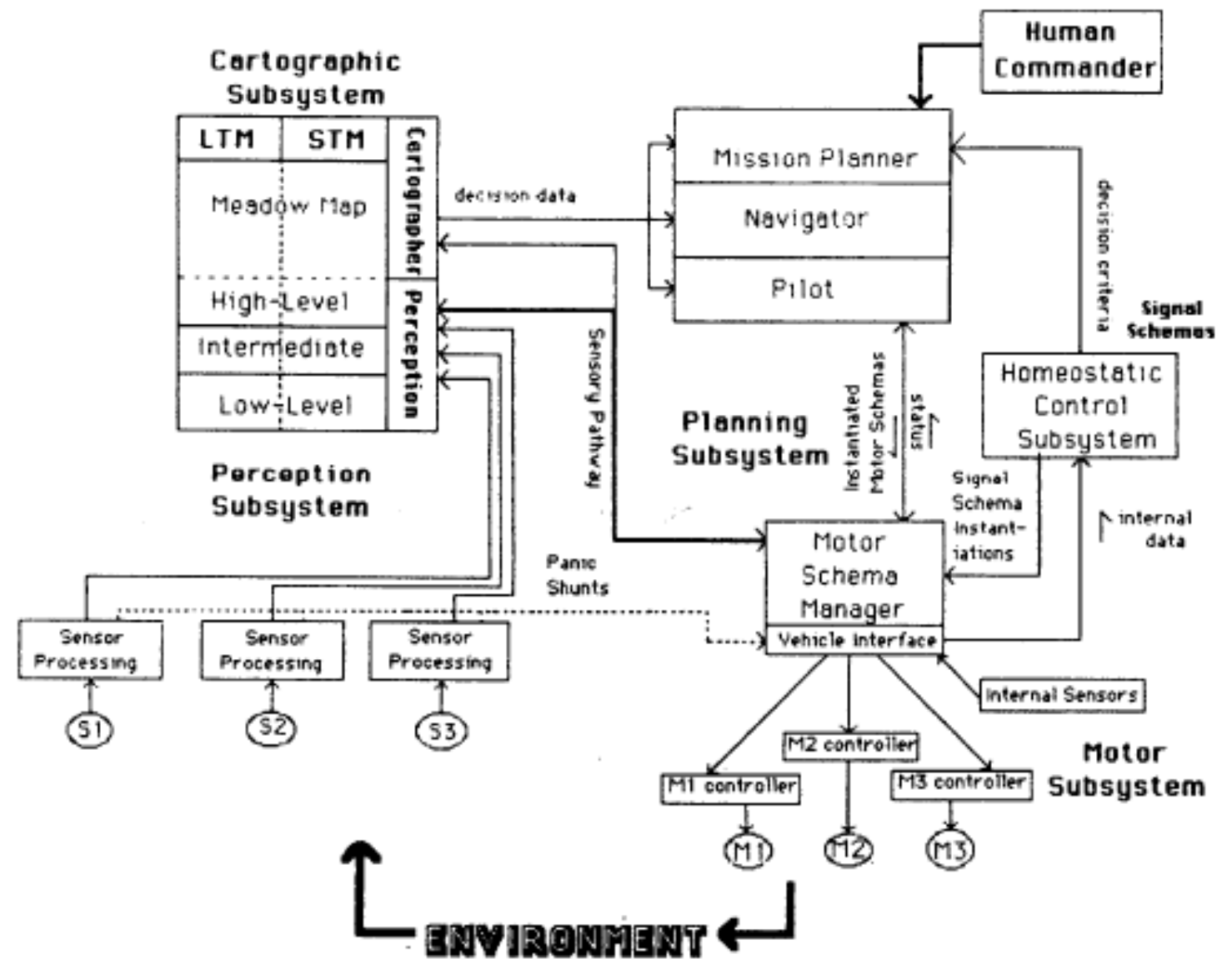
- Explore the environment



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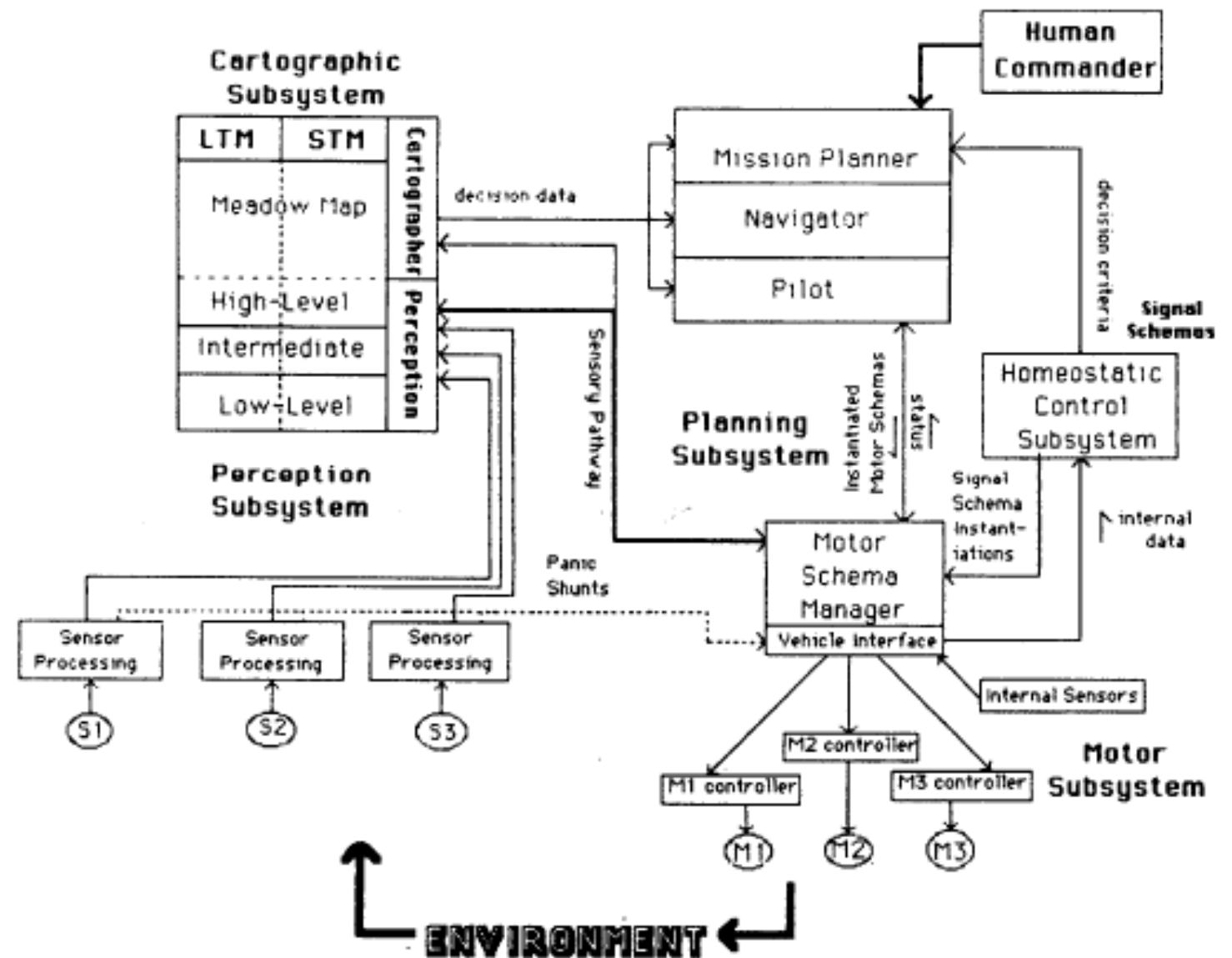
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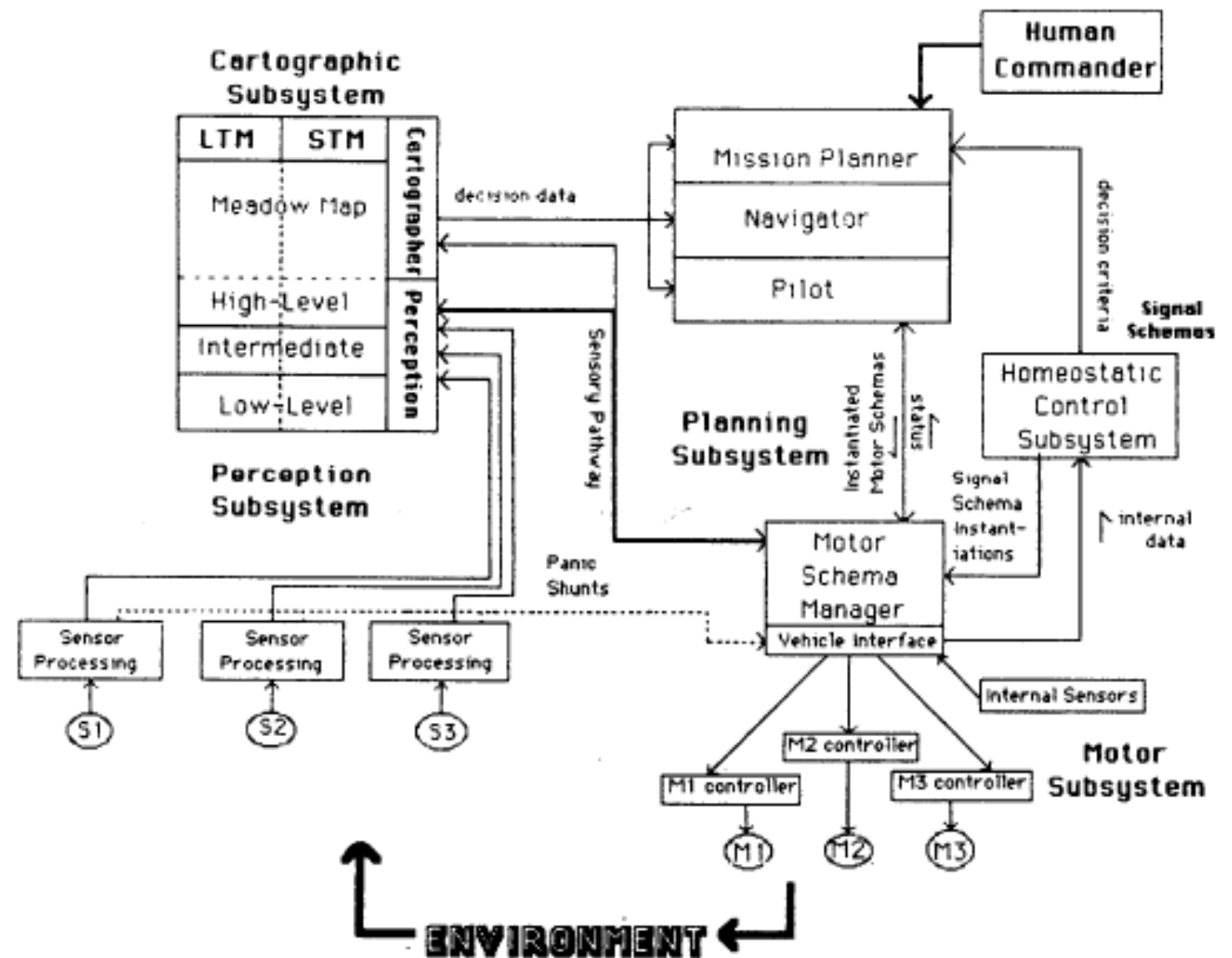
- Explore the environment
- Use a certain strategy (e.g. follow the wall to the right)
- Do not bump into things or people



# Deliberation in, e.g. a navigation system

A robotic system might have several goals to pursue, e.g.

- Explore the environment
- Use a certain strategy (e.g. follow the wall to the right)
- Do not bump into things or people
- Go “home” for recharging in time



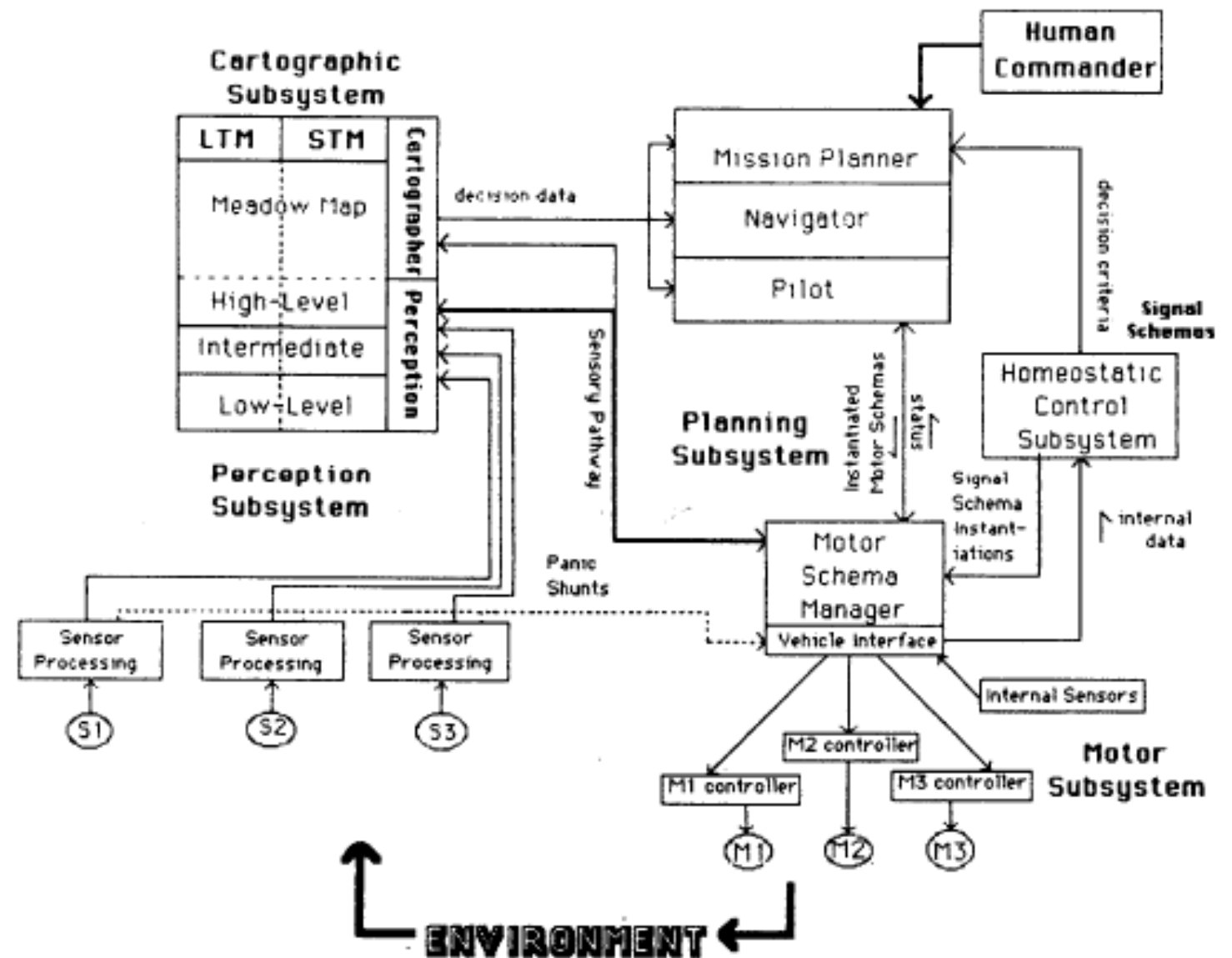


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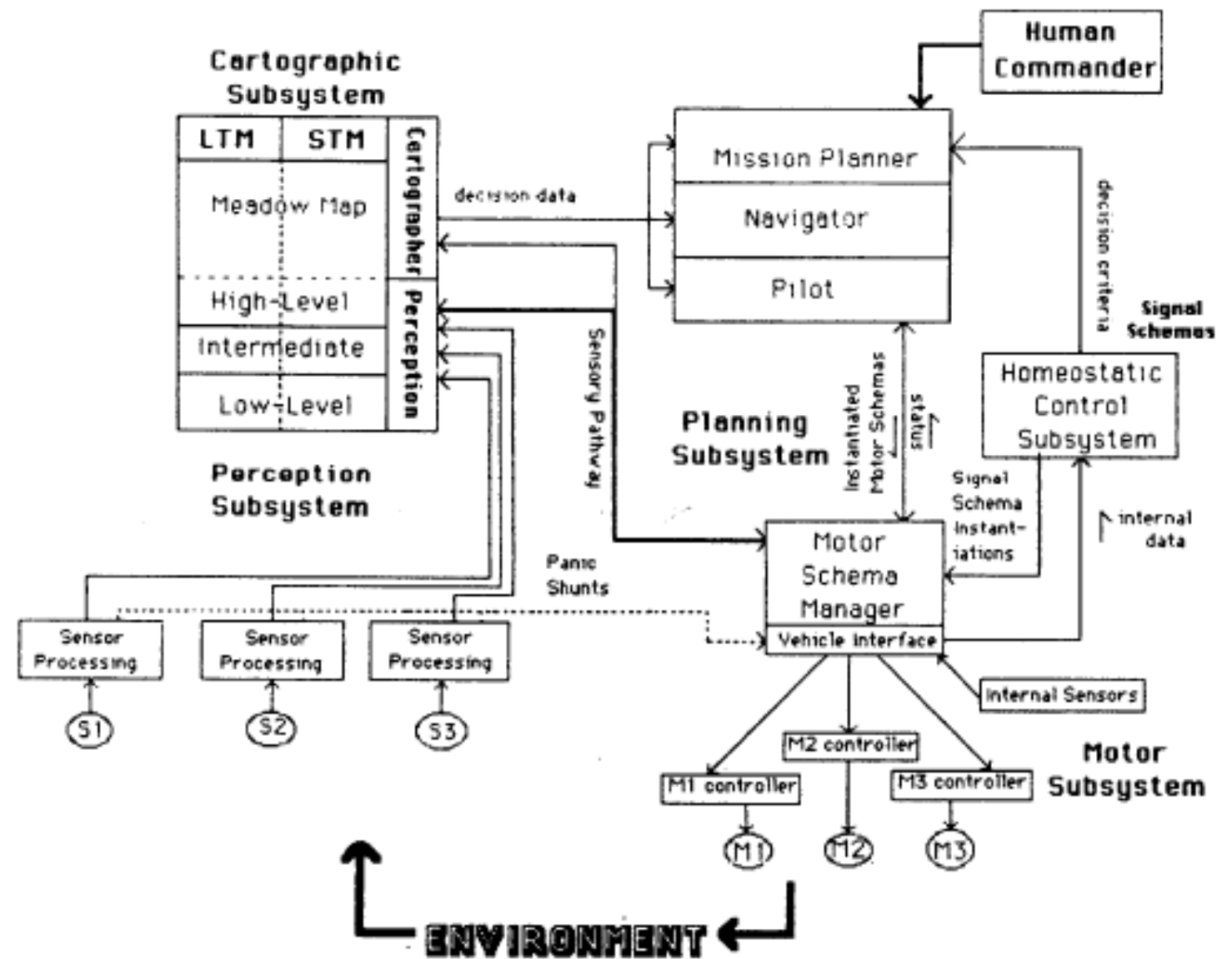
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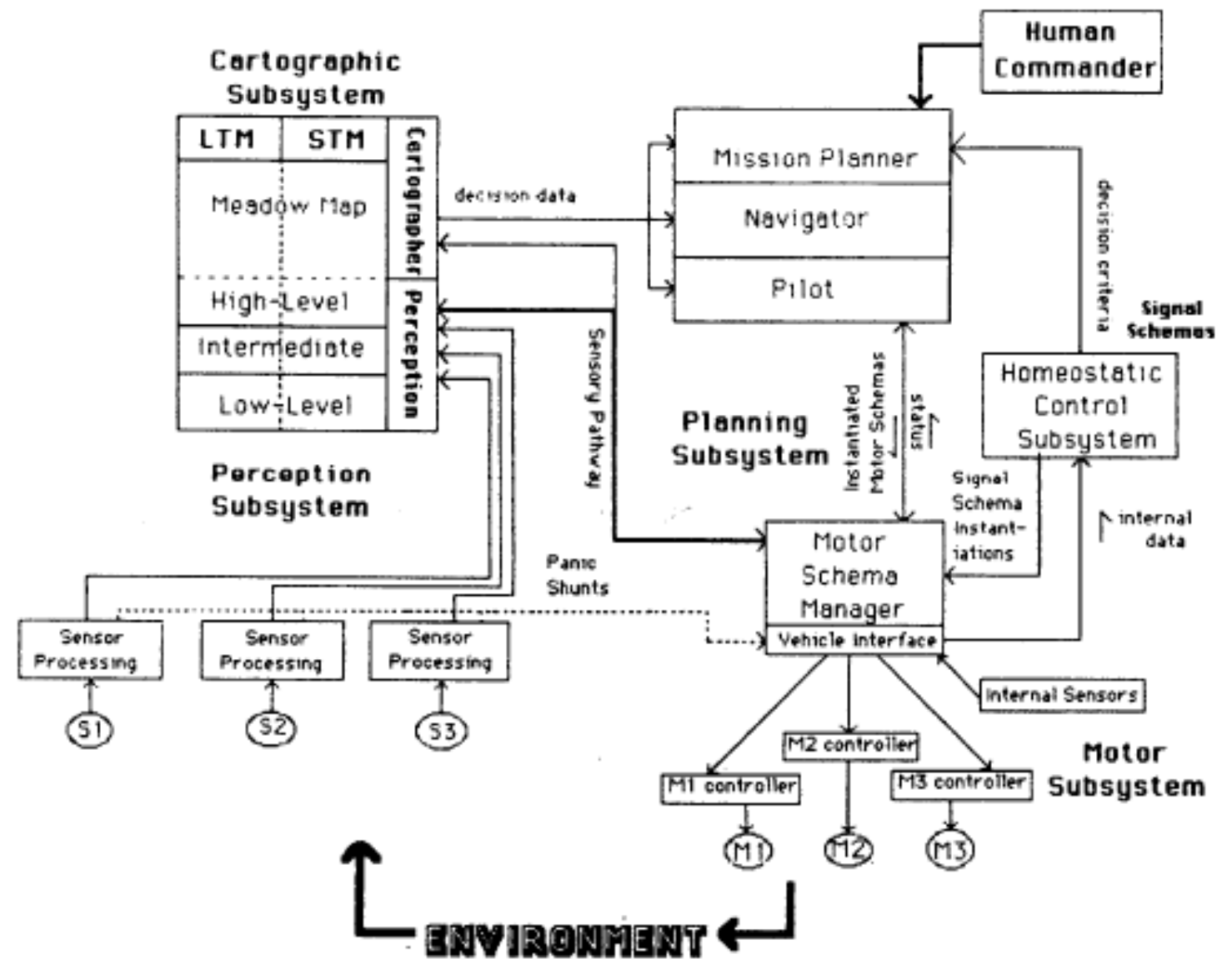
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This decision making unit (deliberation process) can assign weights (priorities) to the behaviours depending on the sensor data.

E.g., when battery level sensor reports a certain level, only the “going home” behaviour and immediate obstacle avoidance are allowed to produce control output, exploring and wall following are ignored.



# Robotics and Semantic Systems @CS

- Lab visit to the Robotlab in M-huset
- Master's projects (Ex-jobb)
  - Internal (research oriented) or external (industry related)
- Contact us: Jacek, Pierre, Elin or other members of the group:  
Volker Krueger, Mathias Haage, Matthias Mayr, Alexander Duerr, Hampus Åström
- Robotics related courses:
  - EDAN70, Project in Computer Science, VT2
  - EDAN95, Applied Machine Learning, HT2
  - MMKF15, Applied Robotics (Automatic Control / Design)
  - MMKN30, Service Robotics (through IKDC)