

# Active Execution Monitoring Using Planning and Semantic Knowledge

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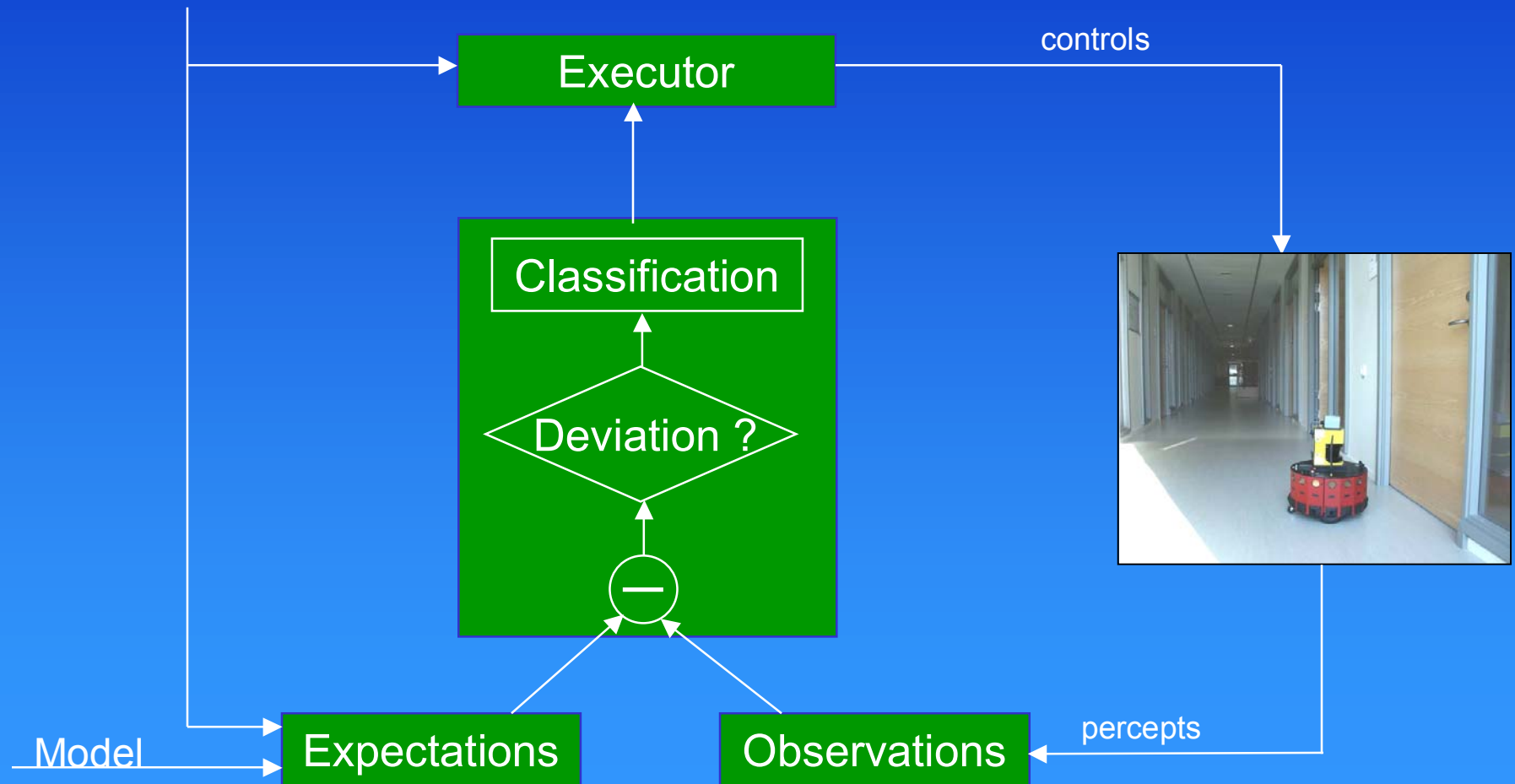
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# Outline

- Overview of Execution Monitoring
- Semantic Knowledge
- The Proposed Framework
- **Active Monitoring**
- **Test Scenarios**
- Conclusions

# Overview of Execution Monitoring

Plan: enter(r1); look-for(c1);....



# Overview of Execution Monitoring

- Expectations to monitor: from action model in planning domain  
action: (enter ?r)  
precond: (and (robot-in in ?r2) (connected ?r2 ?r))  
effect: (robot-in ?r)
- There might be a lot more information that is useful for monitoring, but we don't want it to burden our planning domain
- Use semantic knowledge!

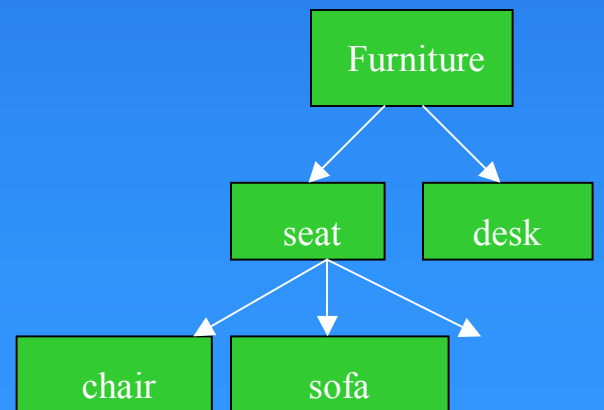
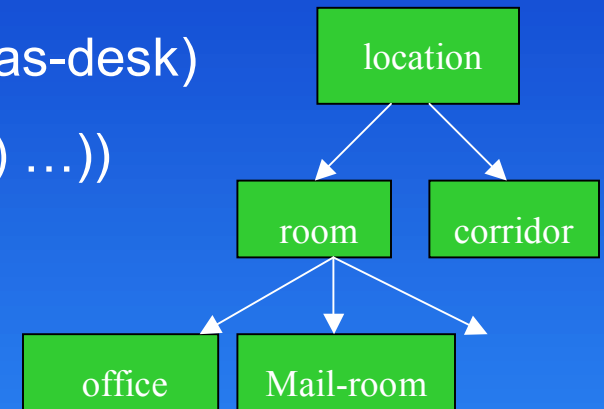
# Semantic Knowledge

- Description Logics: A traditional AI tool
- Knowledge expressed as:

```
(defconcept office :is (:and room (:at-least 1 has-desk)
                                (:at-most 0 sink) ...))
```

```
(defrelation has-desk :domain location
                    :range desk)
```

- Real world description
  - (tell (room r1))
  - (tell (has-desk r1 dsk1)),...
- Inferring implicit knowledge  
(room r1), (has-desk r1 dsk1),...  $\Rightarrow$  (office r1)



# The Proposed Framework

- Identify the assertions to monitor from action model
  - $(\text{enter room1}) \Rightarrow (\text{robot-at room1})$
- Derive implicit expectations from semantic knowledge
  - $(\text{living-room room1}) \Rightarrow (\text{room room1}) \ \& \ (\text{at-least 1 has-desk room1})$   
&...
- Check implicit expectations using available perceptual Information
  - If all expectations are verified, then success
  - If at least one expectation is violated, then failure
  - **If there are expectations with unknown truth values, then more information is needed**

# The Proposed Framework

- If more information is needed, then plan to gather it (active monitoring)
- Sensor-based planning problem
- Actions for checking various forms of expectations as well as for movement, etc.
- Active monitoring steps:
  - generate current belief state and goal
  - generate an information gathering plan
  - execute the information gathering plan

# Active Monitoring: actions

- Actions for checking number constraints
  - Observe and count objects and evaluate the corresponding constraint, e.g.,  
(eval-at-least 2 bed r1)
- Actions for checking observable concepts
  - Check whether an object is of a certain type, e.g.,  
(check-corridor c1)
- Actions for movement and manipulation
  - Change position to gather more information, e.g.,  
(move c1-2)

# Active Monitoring: state and goal

- The initial belief state contains different hypotheses about the unknown truth values of the constraints, e.g.,  
h1: (at-least 1 bed r1)  
h2: (not (at-least 1 bed r1))  
It also contains topological info etc
- The goal formula specifies that the truth value of the constraints must be known, e.g.,  
(known (at-least 1 bed r1))

# Active Monitoring: planning

- PTLPLAN a forward chaining planner
- Search in belief state space
- Plans have the structure of an “if-then-else” program
- Plan actions are executed by translating them into sensori-motoric-cognitive processes
- Branching Conditions are evaluated in the execution-time belief state

# Active monitoring: summary

Action → Explicit expectations    Semantic knowledge



Implicit expectations, compare to observations

- 1) All verified  $\Rightarrow$  ok
- 2) Some violated  $\Rightarrow$  fail
- 3) Some unknown  $\Rightarrow$

## Active monitoring

Domain (special actions)

Initial belief state

Goal spec



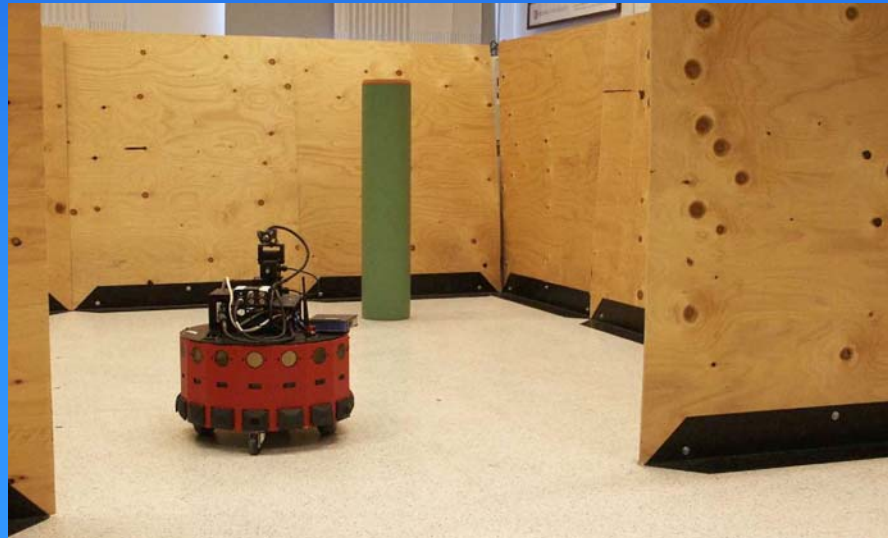
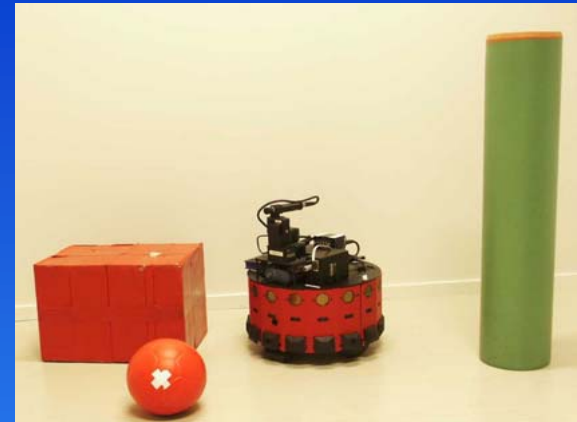
Monitoring plan

generated and → Ok or fail

executed

# Test Scenarios

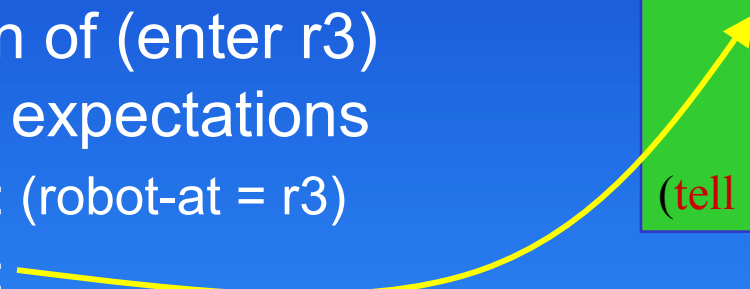
- Loom for semantic knowledge
- Navigation Tasks
- Indoor Environment
  - House with rooms
- Magellan Pro mobile robot
- Simplified Vision
  - Simple objects for furniture items
- Crisp approach



# Test Scenarios

- Task: clean the living-room
- Plan: (enter r3)(clean r3)
  - Execution of (enter r3)
    - ⇒ check expectations
      - explicit: (robot-at = r3)
      - implicit:
        - (room cr), (at-least 1 sofa cr),(exactly 0 sink cr), (exactly 1 TV cr)
      - robot observes *room* but cannot determine the truth values of the other concepts
        - ⇒ Information gathering needed

```
(defconcept living-room :is
  (and room
    (at-least 1 has-sofa)
    (exactly 1 has-tv)
    (exactly 0 has-sink) )
  (tell (living-room r3)))
```



# Test Scenarios

- Information Gathering

- Initial belief state:

- h1: (at-least 1 sofa cr),(exactly 0 sink cr),(exactly 1 TV cr)
    - h2: (not (at-least 1 sofa cr)), ...
    - h3: (at-least 1 sofa cr),(not (exactly 0 sink cr)),...
    - etc.

Topological information etc is also included

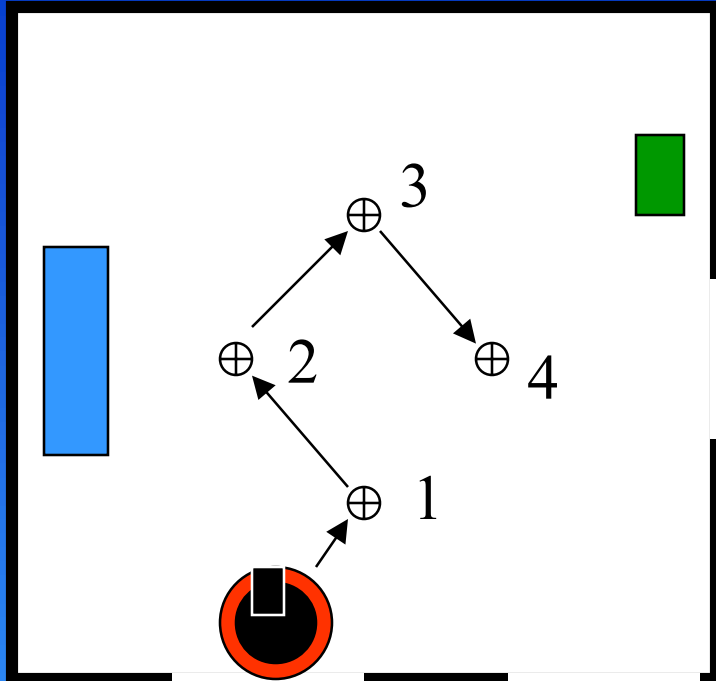
- Goal:

- (known (and (at-least 1 sofa cr)(exactly 0 sink cr)(exactly 1 TV cr))

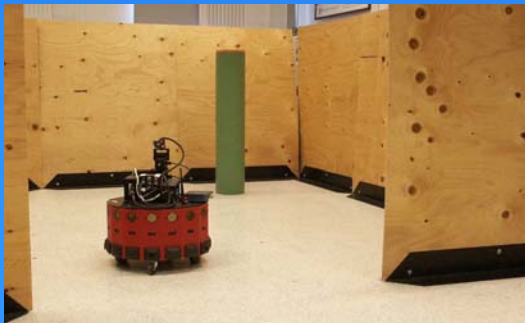
- Plan:

- ((move loc1)(check-exactly 0 sink cr)  
(cond ((not (exactly 0 sink cr)) (:fail))  
((exactly 0 sink cr) (check-exactly 1 TV cr) ...)))

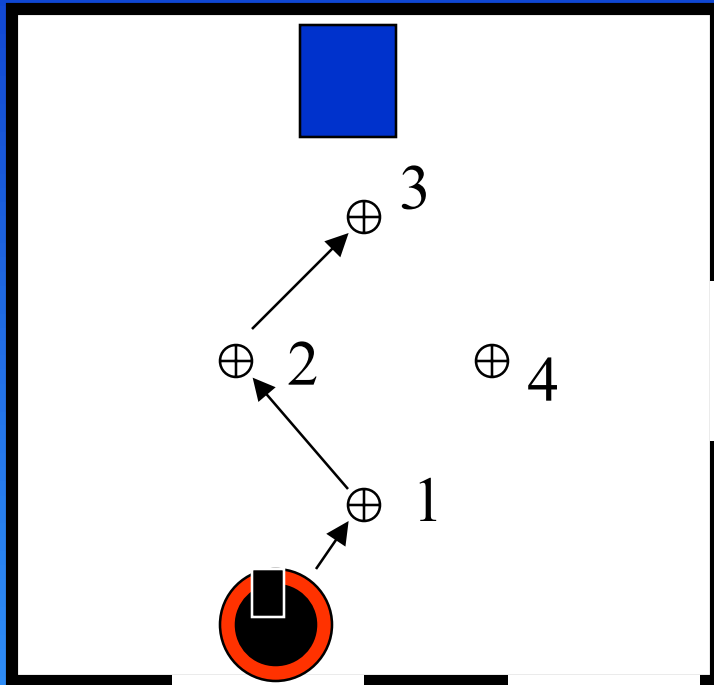
# Test scenarios



- Executing the plan:  
setup #1
  - At point 2:  
sofa seen, and (at-least 1  
has-sofa) verified
  - At point 3: TV seen and  
counted
  - At point 4:  
explored entire room,  
(exactly 1 has-tv)  
verified,  
(exactly 0 has-sink)  
verified
  - Conclusion: correct room



# Test scenarios



- Executing the plan:  
setup #2
  - At point 3:  
(exactly 0 has-sink)  
violated
  - Conclusion: wrong room

# Conclusions

- Use of semantic knowledge for execution monitoring
- Active execution monitoring: planning for information gathering
- Implemented and tested onboard a mobile robot

# Conclusions

- Issues to be addressed:
  - Handling uncertainty (forthcoming paper at IROS-07)
  - Which expectations to check?
  - How to make sure one can continue the original plan (currently: constrained to stay in present room)
  - Deeper experimental evaluation (scalability, etc.)