

# On the Way to Automated Belief Repair for Autonomous Robots

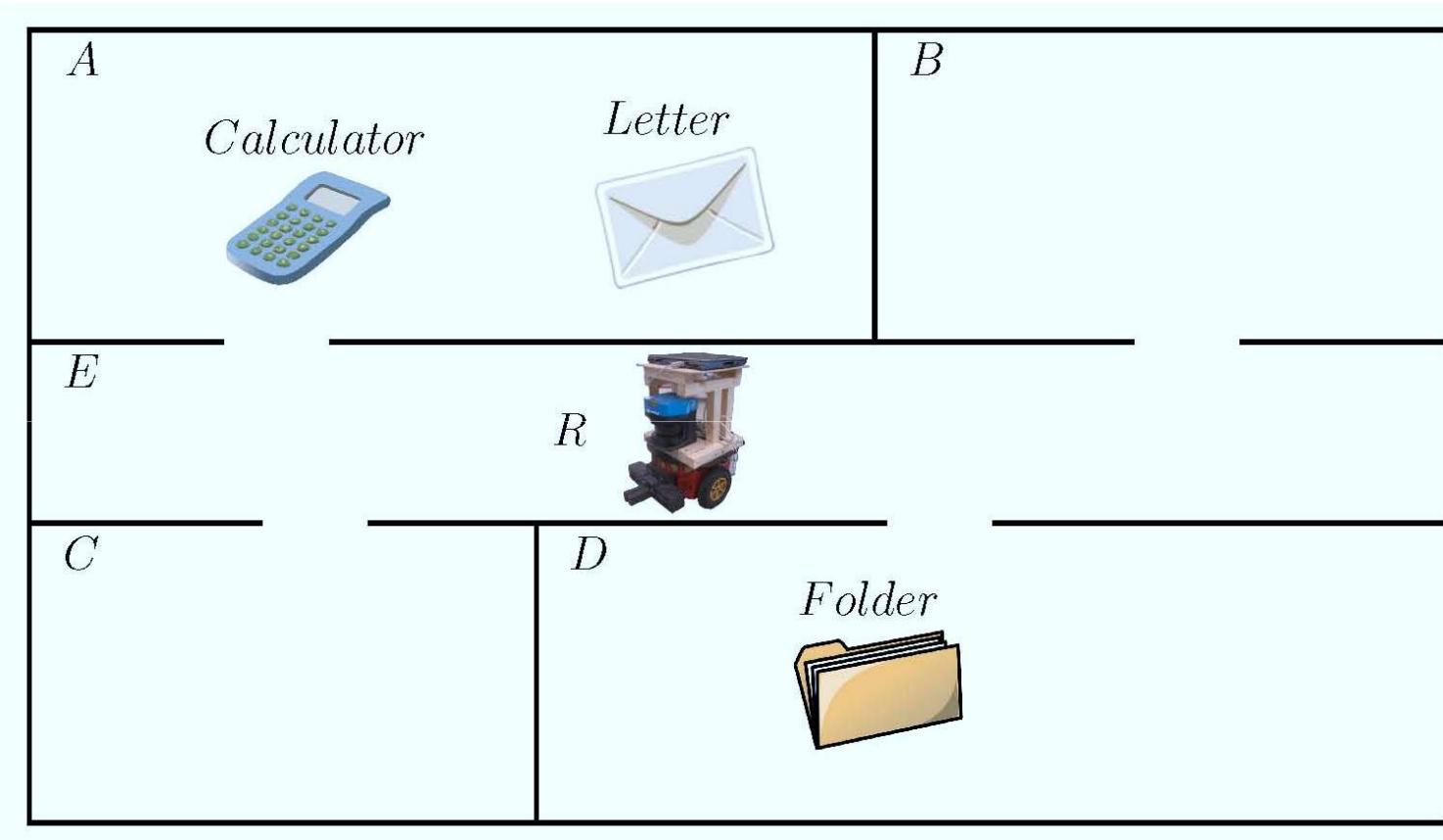
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# Diagnosis & Repair of Beliefs

- most autonomous robots fail due to inconsistencies in their belief (world model)
- reasons for instance are
  - unreliable acting (e.g. move to a wrong room)
  - unreliable perception (e.g. perception of ghost objects)
  - exogenous events (e.g. external agent)
- belief of the robot = knowledge base
- Use of model-based diagnosis to detect and actively handle inconsistencies
- model the intended change of the world (background model - common sense)

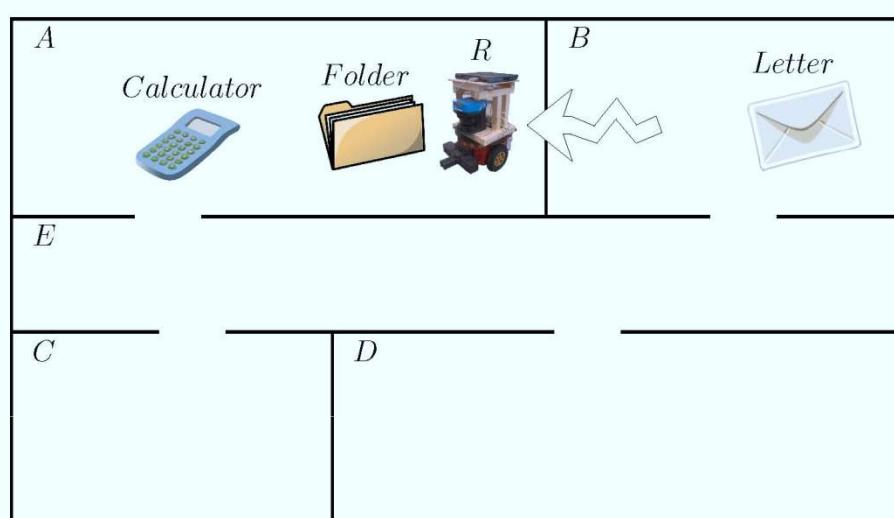
# Belief Diagnosis – A Simple Example



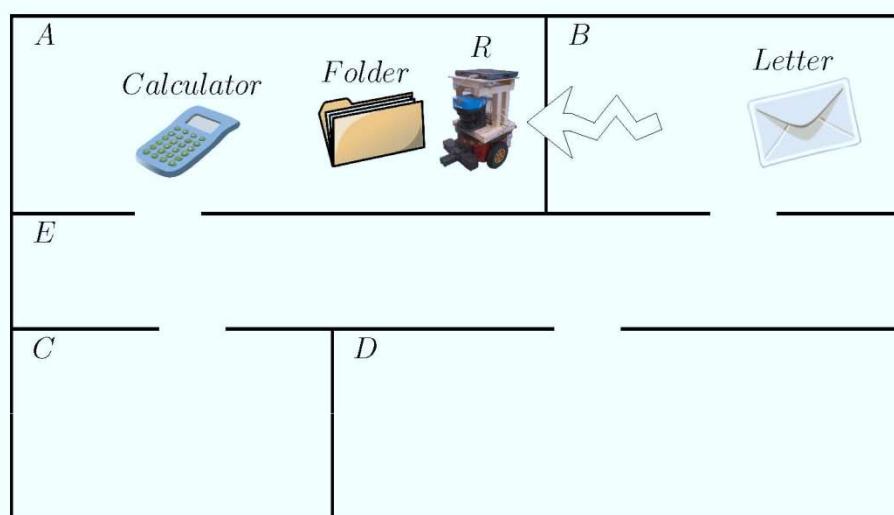
Task: bring the letter to room B and the folder to C

Actions: goto(l), grab(o), release(o)

# Belief Diagnosis - A Simple Solution

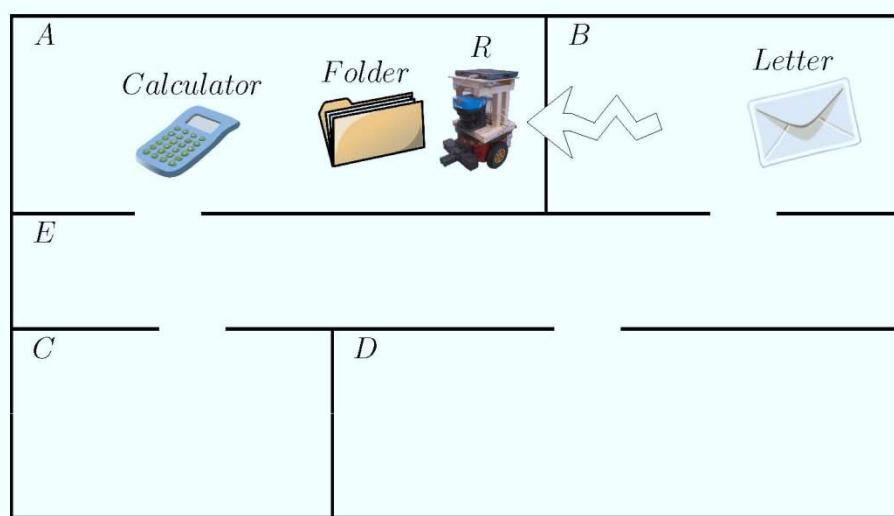


# Belief Diagnosis - A Simple Solution



- Goal
- $\text{isat}(\text{Calculator}, B) \wedge \text{isat}(\text{Folder}, C)$

# Belief Diagnosis - A Simple Solution



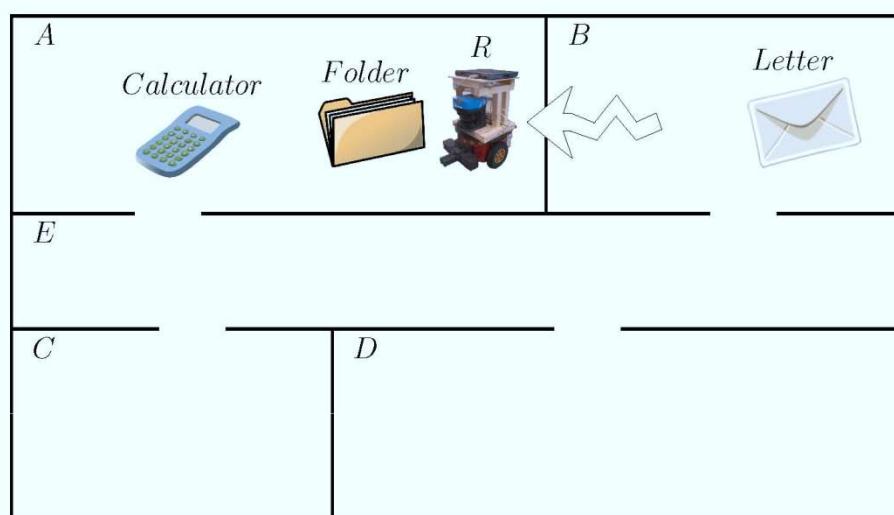
- Perception Robot
- $at(C) \wedge see(Calculator)$
- Axioms + Previous Belief
- $isat(Letter,B) \wedge isat(Calculator,A)$
- Knowledge Base of Robot
- $at(C) \wedge isat(Letter,B) \wedge isat(Calculator,A)$

- Goal
- $isat(Calculator,B) \wedge isat(Folder,C)$

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# Belief Diagnosis - A Simple Solution



- Goal
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- Perception Robot
- $\text{at}(C) \wedge \text{see}(\text{Calculator})$

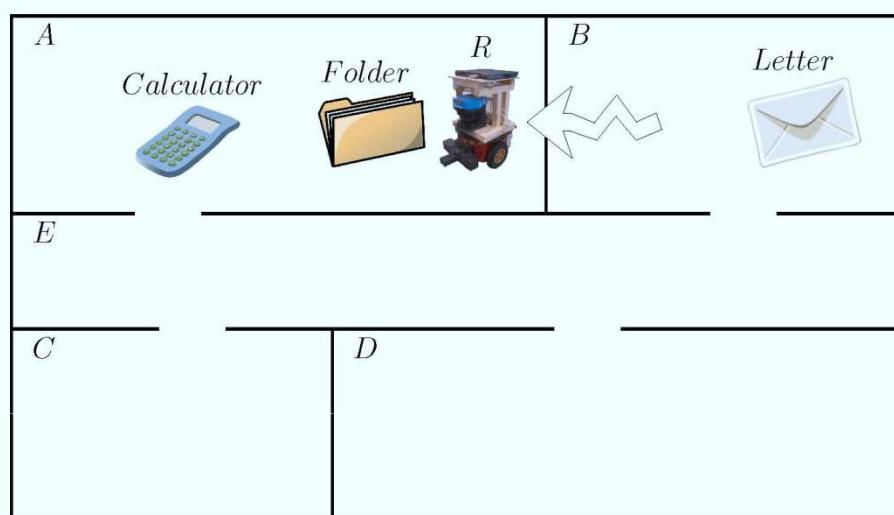
+  
**Background Model**  
 $\text{at}(I) \wedge \text{see}(o) \rightarrow \text{isat}(o, I)$

- Axioms + Previous Belief
- $\text{isat}(\text{Letter}, B) \wedge \text{isat}(\text{Calculator}, A) \wedge \text{isat}(\text{Calculator}, C)$

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- Knowledge Base of Robot
- $\text{at}(C) \wedge \text{isat}(\text{Letter}, B) \wedge \text{isat}(\text{Calculator}, A) \wedge \text{isat}(\text{Calculator}, C)$

# Belief Diagnosis - A Simple Solution



- Goal
- $\text{isat}(\text{Calculator}, B) \wedge \text{isat}(\text{Folder}, C)$

- Perception Robot
- $\text{at}(C) \wedge \text{see}(\text{Calculator})$

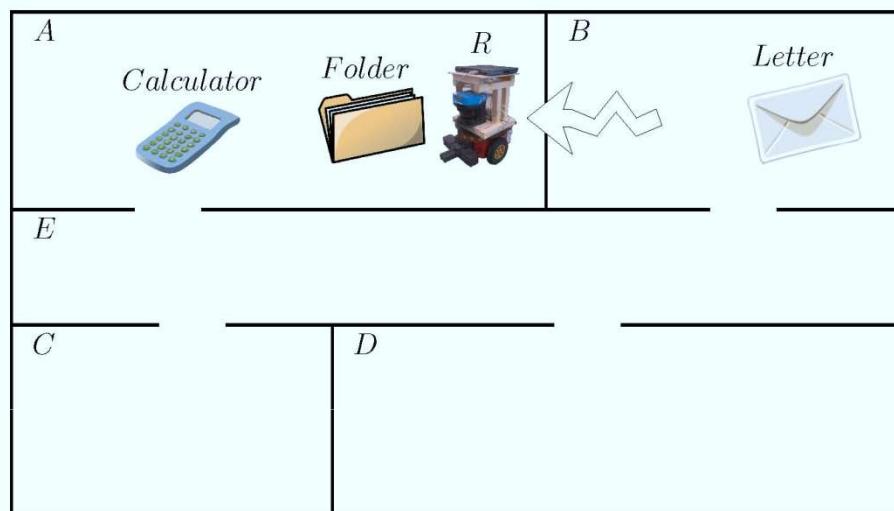
**Background Model**  
 $\text{at}(I) \wedge \text{see}(o) \rightarrow \text{isat}(o, I)$

- Axioms + Previous Belief
- $\text{isat}(\text{Letter}, B) \wedge \text{isat}(\text{Calculator}, A) \wedge \text{isat}(\text{Calculator}, C)$

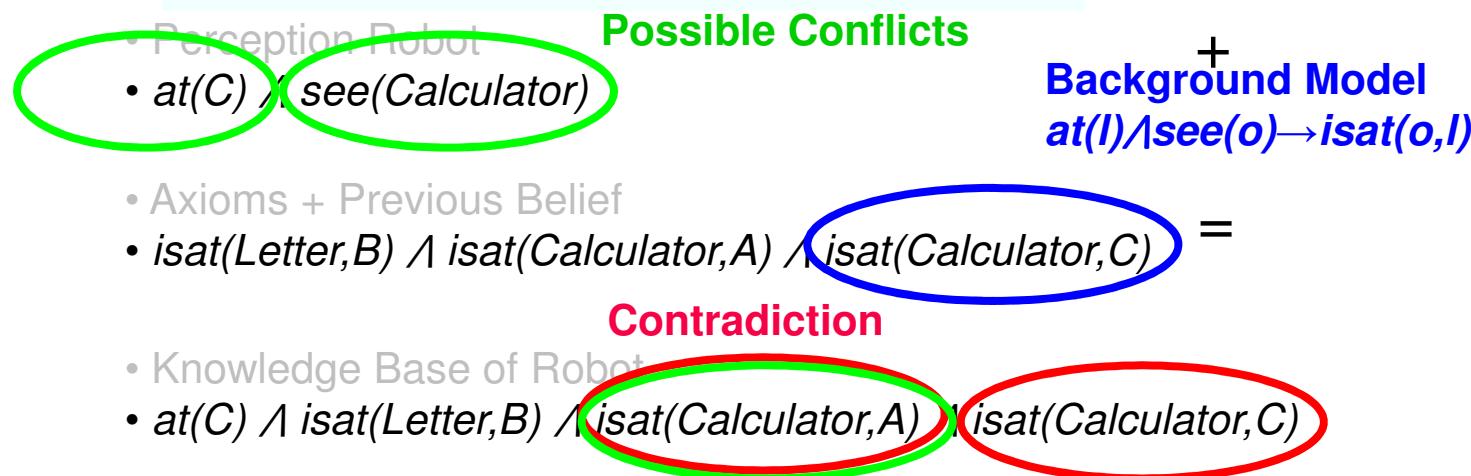
**Contradiction**

- Knowledge Base of Robot
- $\text{at}(C) \wedge \text{isat}(\text{Letter}, B) \wedge \text{isat}(\text{Calculator}, A) \wedge \text{isat}(\text{Calculator}, C)$

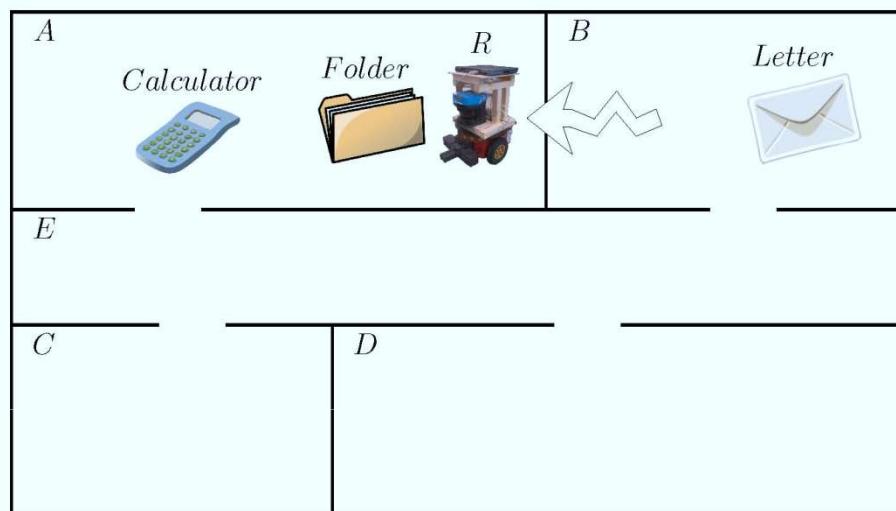
# Belief Diagnosis - A Simple Solution



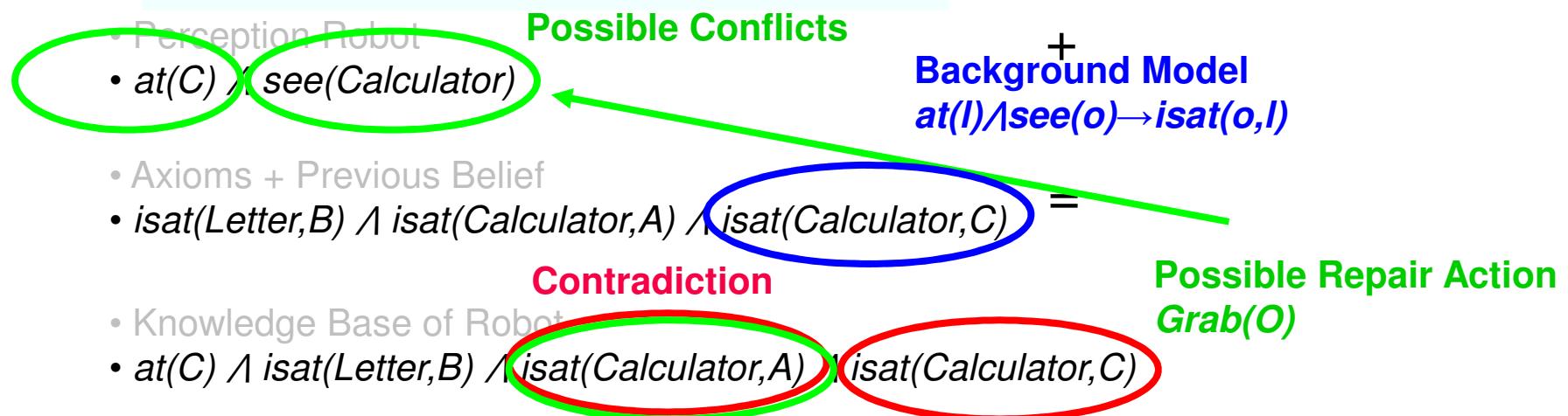
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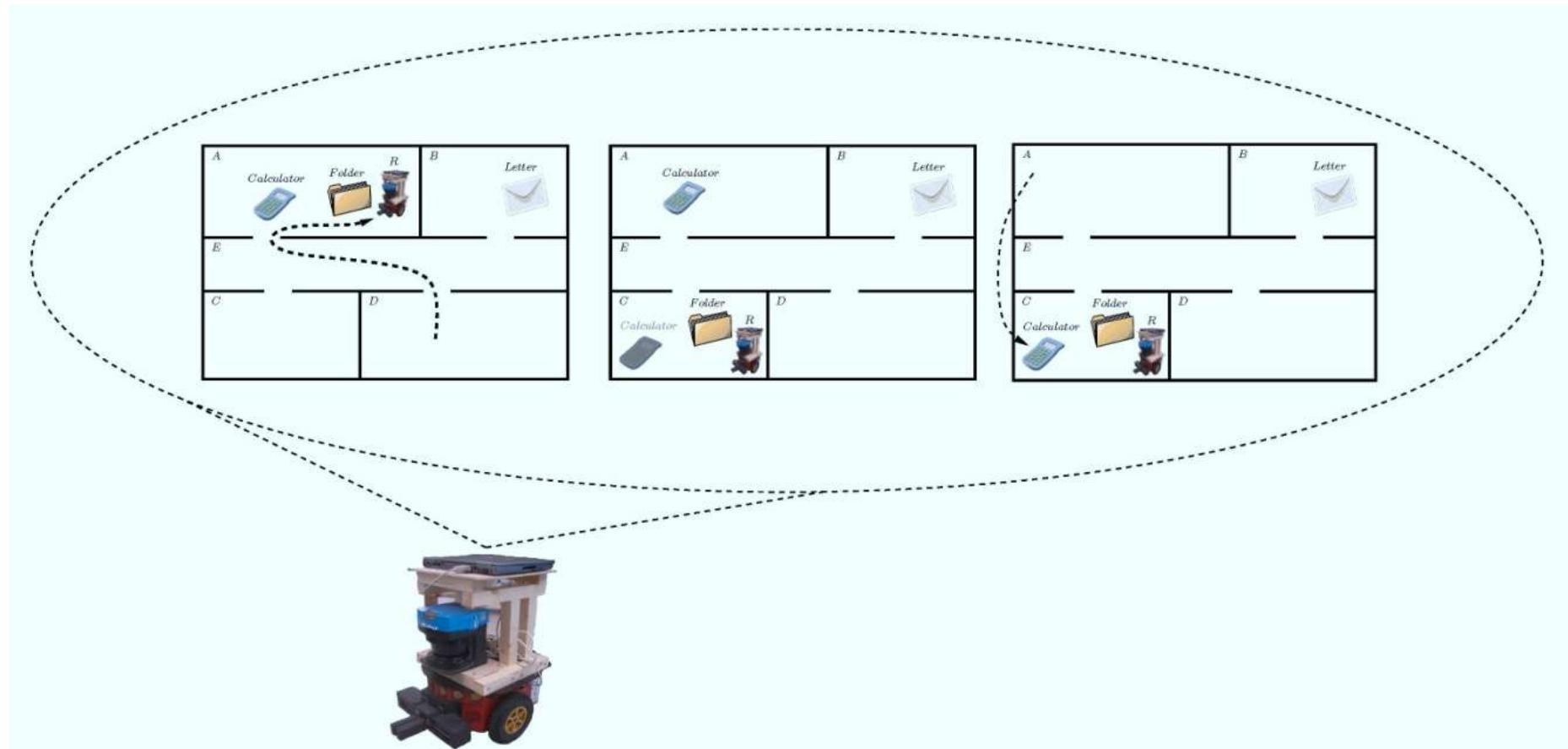
# Belief Diagnosis - A Simple Solution



- Goal
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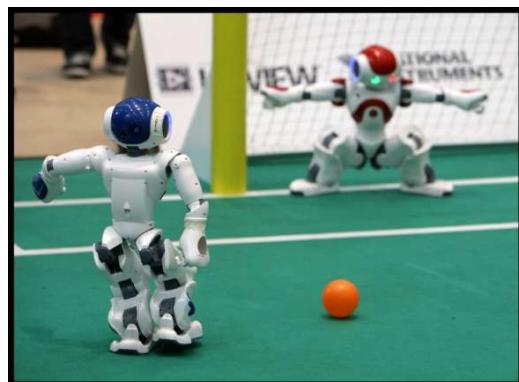
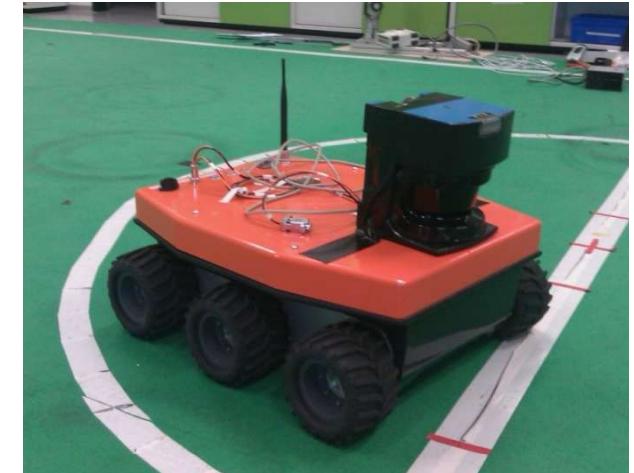
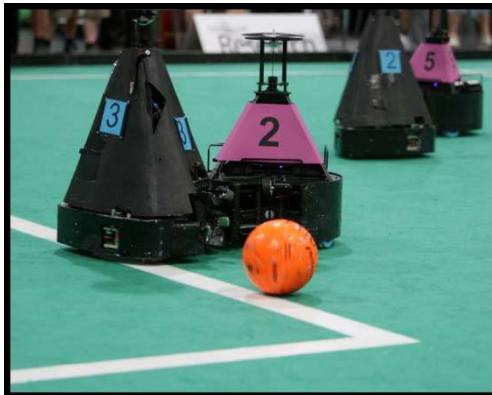


# Dealing with Multiple Worlds



# Conclusion

- robots might face inconsistencies in their internal belief of the world
- automated reaction is desired for truly autonomous systems
- model-based reasoning can help for fault localization
  - formalization of belief diagnosis
- robots have to deal with multiple worlds



# Thank you!