

CMRoboBits:  
Creating an Intelligent AIBO Robot  
*Multi-Robot Systems II*

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<http://www.andrew.cmu.edu/course/15-491>

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# Four-Legged (AIBO) Robot Soccer

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- Teams of 4 robots (initially 3 robots)
- Remarkable hardware - SONY AIBO robots
- Sensing, computing, and communication onboard





# Teamwork

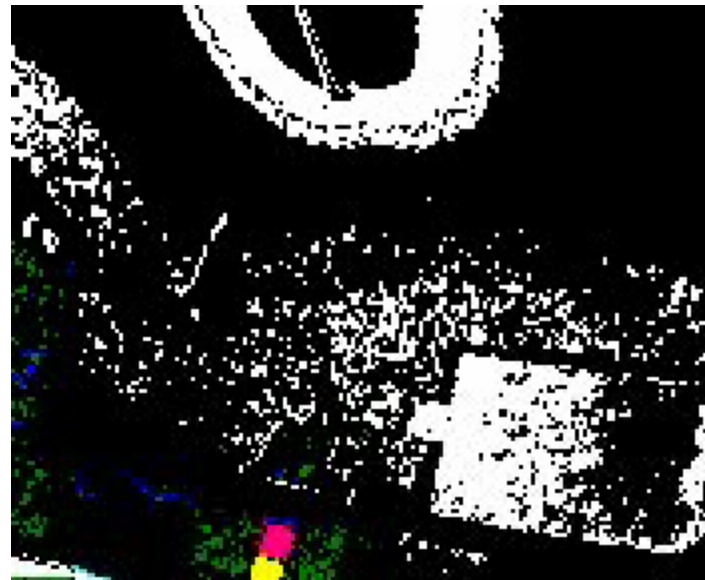
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- Teamwork without communication
  - Team is set of individual robots
  - View of the world from own sensors
  - Teamwork achieved through *roles*
    - Attacker: *“Can I see the ball? Go to Ball. Where am I and where is the goal? Kick ball to goal.”*
    - Goalie: *“Can I see the ball? Is the ball next to me? Clear the ball. Where am I? Go back to defend goal.”*
- Teamwork with communication?
  - Own sensors, communication, roles



# Vision

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# Sensor Processing

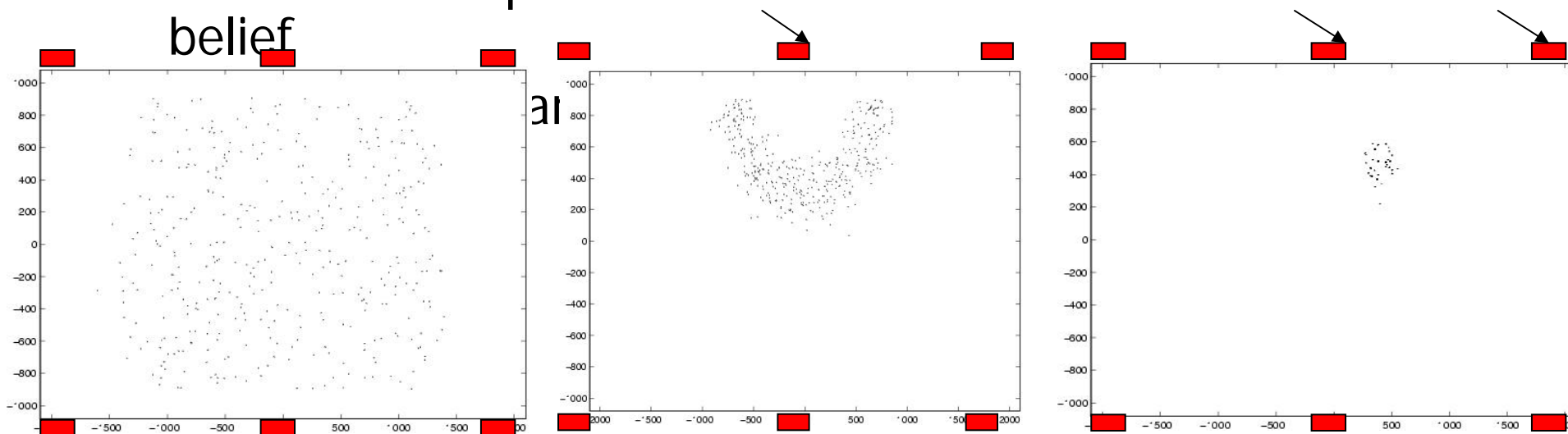
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- Goal:
  - Estimate the *state* of the environment
  - Abstract from sensor *signals* to *symbols*
  - ...orange ball in front... wall at 2m distance... door on the left... green light... person in front... personX entering the room...



# Robot's Position – Localization

- *Apriori*: motion model, map
- *Given*: actual motion, sensing
- *Compute*: probabilistic distribution of position belief



# State Information

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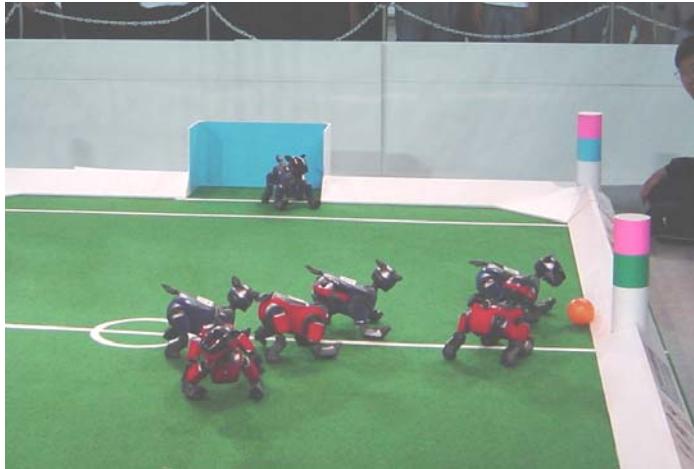
- State - Localization
  - Position in *absolute* referential space
- State – further processed sensory data
  - “big” vector of task-relevant quantities:
    - *Relative* distance to task-relevant objects
      - Ball, goal, other robots, landmarks





# Multi-Robot World Modeling

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- Communication with latency
- Noise in perception/assessment
- Multiple (variable) teammates

**Challenge: Combine local and communicated information to form a coherent world model**

# Common World Model

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- Shared information:
  - Localization plus relative information produces *shared global* coordinates of objects
- Discussion
  - Impact of perceptual errors
  - Single versus multiple robots



# Use of Shared Information

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- Tracking
- Position of *seen* and *unseen* object
- Example:
  - Where is the ball?



# **Modeling from probabilistic effects of robot's own actions**

**Manuela Veloso, Paul E. Rybski,  
Sonia Chernova, Colin McMillen**

# “Level 1” Prediction

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- Robot predicts position of *temporally unseen/lost* object through:

State MEMORY and MODEL  
of object motion and effect of actions

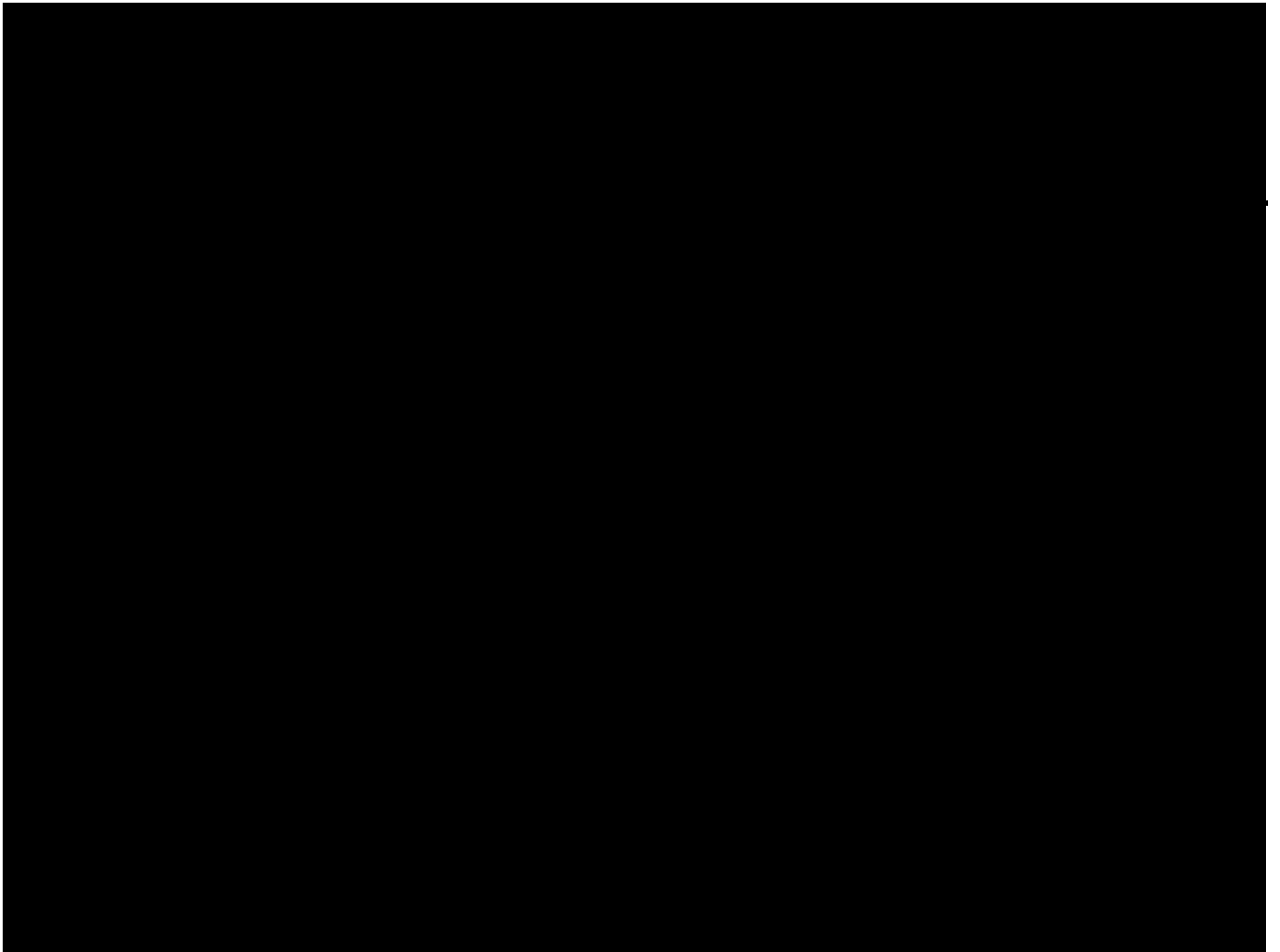


# Action Models

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- Actions are described in terms of
  - Preconditions
    - Position of the ball with respect to the robot
    - Position of the robot on the field
  - Probabilistic effects
    - Expected final position of the ball – mean, variance





# **Modeling from probabilistic effects of robot's own actions**

**Manuela Veloso, Paul E. Rybski,  
Sonia Chernova, Colin McMillen**



# “Level 2” Prediction

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- Robot predicts position of *temporally unseen/lost* object through:

State MEMORY and MODEL of object motion and action, which includes probabilistic effects

- Effects are visited in order according to their probability



# **Modeling from teammate communicated observation**

**Manuela Veloso, Paul E. Rybski,  
Sonia Chernova, Colin McMillen**

# “Level 3” Prediction

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- Robot predicts position of *temporally unseen/lost* object through:

State MEMORY and MODEL of object motion and action, which includes probabilistic effects, and **information from teammates**



# State Estimation

## *RMH: Ranked Multi-Hypothesis*

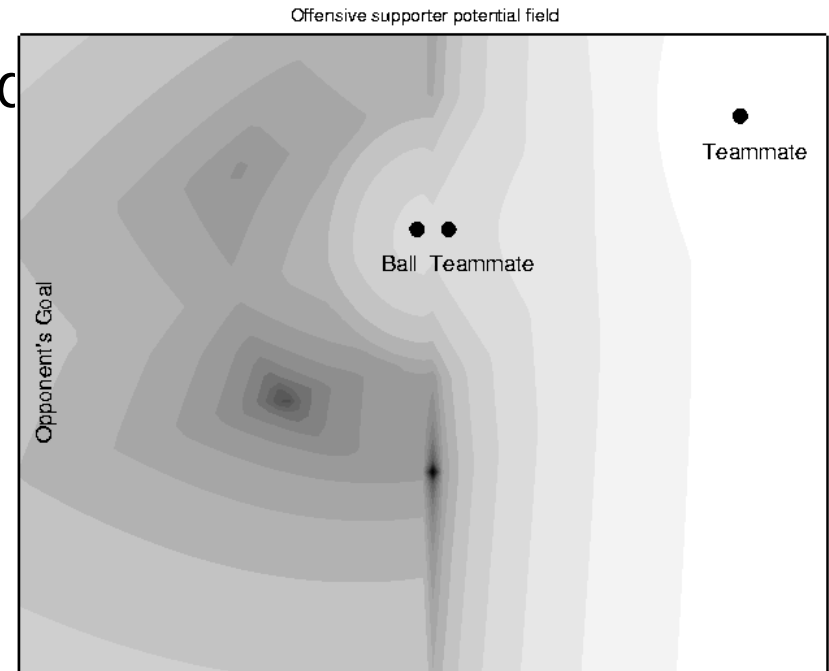
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- Use *own* perception
- If object not in own view:
  - Generate a probabilistic set of hypotheses
    - Nondeterministic models of own actions
    - Teammate shared sensory data
    - ...
  - Rank the hypotheses according to a confidence and utility function
  - Visit in order the ranked hypotheses



# Model, Multi-Robot Coordination

1. Role assignment
  - Primary attacker, offensive supporter, defensive supporter
2. Strategic positioning





# Summary

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- Teamwork
- Share and use of multi-source information
  - RMH State estimation
  - Ranked – probabilistic effects, possible errors in communicated information
- Use
  - Tracking
  - Team coordination

