

CS 394R

Reinforcement Learning: Theory and Practice

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Good Morning Colleagues

- Are there any questions?

Logistics

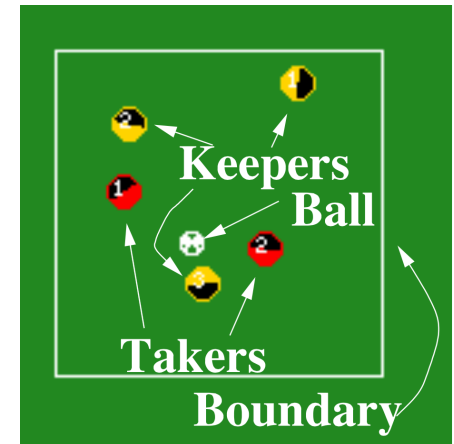
- First 3 assignments due **next Friday by midnight**
- Project proposals due **next Thursday 9:30am**

Outline

- Get a feel for how to approach a complex RL problem
- Keepaway Domain
- Group Activity!
- One approach and extensions

Keepaway: A Subtask of 2D Simulated Soccer

- Play in a **small area**
- **Keepers** try to keep the ball
- **Takers** try to get the ball



- **Episode:**
 - Players and ball reset randomly
 - Ball starts near a keeper
 - Ends when taker gets the ball or ball goes out
- Performance measure: **average possession duration**

Keepaway

- **Sensations**

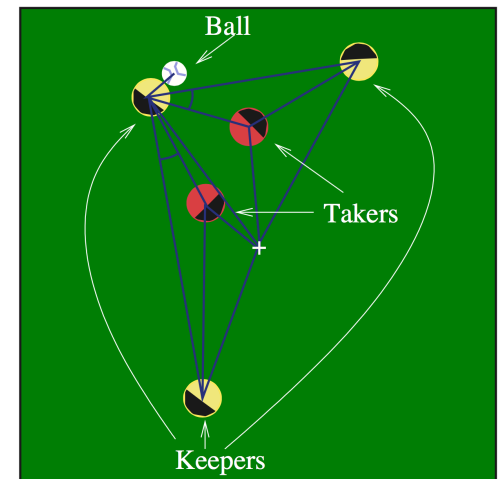
- Your position
- Teammate and opponent positions
- Ball position
- Landmark positions

- **Raw Actions**

- Move(x, y)
- Kick(x, y, power)

- **Higher level** actions/skills

- HoldBall, PassBall(k), GoToBall, GetOpen



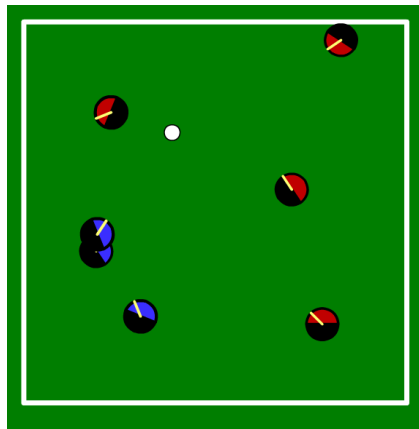
Some questions to think about...

- **State/Action** space?
- **Reward** function?
- Function **approximation**?
- MDP formulation
 - Each agent learns separately?
 - Each agent shares a set of learned skills?
- What will be **learned**, and what will be **hand-coded**?
 - If it's a mix, what will the final policy look like?
- Keep the learning problem **tractable**!

One approach...

- [Reinforcement Learning for RoboCup-Soccer Keepaway](#)
Peter Stone, Richard S. Sutton, and Gregory Kuhlmann.
Adaptive Behavior, 2005.
- [Shivaram Kalyanakrishnan](#) and [Peter Stone](#). **Learning Complementary Multiagent Behaviors: A Case Study.**
RoboCup 2009: Robot Soccer World Cup XIII, pp. 153–165,
Springer Verlag, 2010.

Extension: Transfer Learning



4v3

5v4

