

# **CS378**

# **Autonomous Multiagent Systems**

## **Spring 2005**

**Prof: Peter Stone**  
**TA: Nate Kohl**

Department of Computer Sciences  
The University of Texas at Austin

Week 6a: Tuesday, February 21st

# Good Afternoon, Colleagues

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Are there any questions?

# Logistics

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- Next week's readings posted

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- Holte talk tomorrow at 4pm
- Final project — have partners?
- Use the undergrad writing center!

# Final Projects

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## **Proposal (3/2):** 3+ pages

- What you're going to do; graded on writing

## **Progress Report (4/6):** 5+ pages + binaries + logs

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**Due at beginning of classes**

# Overview of the Readings

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**Kok03:** Coordination graphs

**Riedmiller05:** Reinforcement learning

# Architecture for Action Selection

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# Coordination Graphs

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- $R_i(A) \mapsto \mathbb{R}$
- Coordination problem:  $R_1 = \dots = R_n = R$
- Nash equilibrium: no agent could do better given what others are doing.
- May be more than one (chicken)

# Example from the paper

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- How are the results propagated back?
- Let's try again with  $G_1$  eliminated first



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- Assume global state information
- Finds pass sequences and starts players moving ahead of time.
- Note the results: with and without coordination.

# Class Discussion

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Safder Hasan on “action selection” vs. coordination graphs