CS394R
Reinforcement Learning: Theory and Practice

Scott Niekum and Peter Stone

Department of Computer Science
The University of Texas at Austin

Good Morning Colleagues

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- Are there any questions?

Logistics

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- Final exam

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- Solution methods start in Chapter 4
  - What does it mean to **solve** an RL problem?

Formulating the RL problem

- Art more than science
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- Discount factor part of the environment

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- Polynomial time convergence (in number of states and actions) even though m^n policies.
  - Ignoring effect of γ and bits to represent rewards/transitions

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  - Then: no model, but bootstrapping