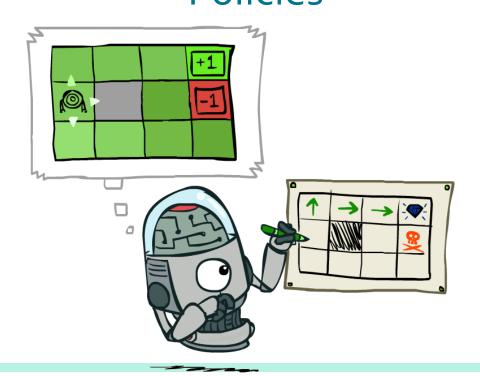
# Advanced Topics in Al Policies





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Co-financed by the Connecting Europ Facility of the European Union

[These slides were created by Dan Klein and Pieter Abbeel for CS188 Intro to AI at UC Berkeley. All materials are available at http://ai.berkeley.edu.]

# Computing Actions from Values

Let's imagine we have the optimal values V\*(s)



- How should we act?
  - It's not obvious!
- We need to do a mini-expectimax (one step)  $\pi^*(s) = \arg \max_{a} \sum_{s'} T(s, a, s') [R(s, a, s') + \gamma V^*(s')]$
- This is called policy extraction, since it gets the policy implied by the values





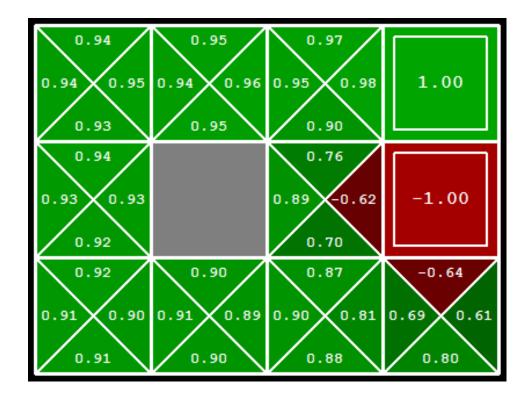
# Computing Actions from Q-Values

Let's imagine we have the optimal q-values:

- How should we act?
  - Completely trivial to decide!

 $\pi^*(s) = \arg\max_a Q^*(s,a)$ 

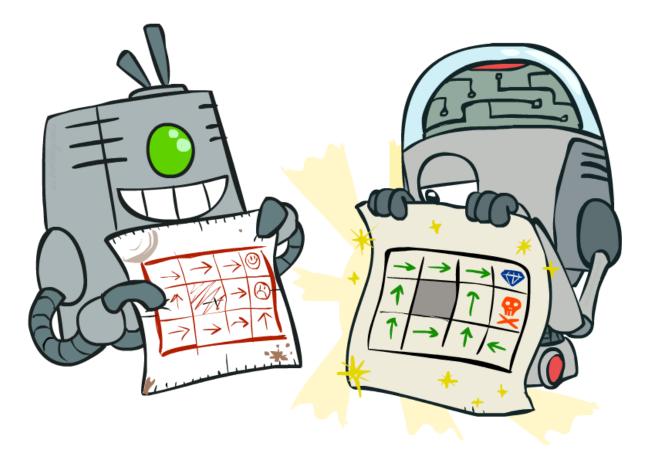
Important lesson: actions are easier to select from q-values than values!







# Policy Methods







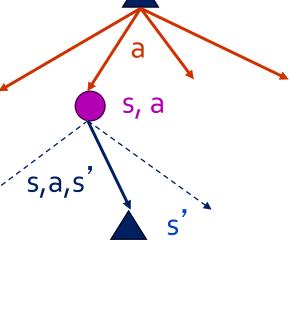
### Problems with Value Iteration

Value iteration repeats the Bellman updates:

$$V_{k+1}(s) \leftarrow \max_{a} \sum_{s'} T(s, a, s') [R(s, a, s') + \gamma V_k(s')]$$

- Problem 1: It's slow  $O(S^2A)$  per iteration
- Problem 2: The "max" at each state rarely changes
- Problem 3: The policy often converges long before the values







#### k=12

00	O Gridworld Display				
0.64	▶ 0.74 ▶	0.85 →	1.00		
• 0.57		• 0.57	-1.00		
• 0.49	∢ 0.42	• 0.47	∢ 0.28		

VALUES AFTER 12 ITERATIONS

Noise = 0.2 Discount = 0.9 Living reward = 0





### k=100

0 0	Gridworl	d Display	-
0.64 →	0.74 →	0.85 )	1.00
• 0.57		• 0.57	-1.00
• 0.49	∢ 0.43	▲ 0.48	∢ 0.28

VALUES AFTER 100 ITERATIONS

Noise = 0.2 Discount = 0.9 Living reward = 0





# Advanced Topics in Al Next: Policy Iteration





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