## $\begin{array}{c} \text{CS 188} \\ \text{Fall 2023} \end{array}$

## Midterm Review MDPs

## Q1. MDP

Pacman is using MDPs to maximize his expected utility. In each environment:

- Pacman has the standard actions {North, East, South, West} unless blocked by an outer wall
- There is a reward of 1 point when eating the dot (for example, in the grid below, R(C, South, F) = 1)
- The game ends when the dot is eaten
- (a) Consider a the following grid where there is a single food pellet in the bottom right corner (F). The **discount** factor is 0.5. There is no living reward. The states are simply the grid locations.



(i) What is the optimal policy for each state?

State	$\pi(state)$
A	
В	
С	
D	
Е	

(ii) What is the optimal value for the state of being in the upper left corner (A)? Reminder: the discount factor is 0.5.

 $V^*(A) =$ 

(iii) Using value iteration with the value of all states equal to zero at k=0, for which iteration k will  $V_k(A) = V^*(A)$ ?

k =

(b) Consider a new Pacman level that begins with cherries in locations D and F. Landing on a grid position with cherries is worth 5 points and then the cherries at that position disappear. There is still one dot, worth 1 point. The game still only ends when the dot is eaten.

<sup>A</sup> C	во		
С	D	Е	F

(i) With no discount ( $\gamma = 1$ ) and a living reward of -1, what is the optimal policy for the states in this level's state space?

(ii) With no discount ( $\gamma = 1$ ), what is the range of living reward values such that Pacman eats exactly one cherry when starting at position A?

## Q2. MDPs: Value Iteration

An agent lives in gridworld G consisting of grid cells  $s \in S$ , and is not allowed to move into the cells colored black. In this gridworld, the agent can take actions to move to neighboring squares, when it is not on a numbered square. When the agent is on a numbered square, it is forced to exit to a terminal state (where it remains), collecting a reward equal to the number written on the square in the process.

Gridworld G



You decide to run value iteration for gridworld G. The value function at iteration k is  $V_k(s)$ . The initial value for all grid cells is 0 (that is,  $V_0(s) = 0$  for all  $s \in S$ ). When answering questions about iteration k for  $V_k(s)$ , either answer with a finite integer or  $\infty$ . For all questions, the discount factor is  $\gamma = 1$ .

- (a) Consider running value iteration in gridworld G. Assume all legal movement actions will always succeed (and so the state transition function is deterministic).
  - (i) What is the smallest iteration k for which  $V_k(A) > 0$ ? For this smallest iteration k, what is the value  $V_k(A)$ ?
    - k =\_\_\_\_\_  $V_k(A) =$ \_\_\_\_\_
  - (ii) What is the smallest iteration k for which  $V_k(B) > 0$ ? For this smallest iteration k, what is the value  $V_k(B)$ ?

 $k = ____ V_k(B) = ____$ 

(iii) What is the smallest iteration k for which  $V_k(A) = V^*(A)$ ? What is the value of  $V^*(A)$ ?

 $k = \_ \qquad \qquad V^*(A) = \_$ 

(iv) What is the smallest iteration k for which  $V_k(B) = V^*(B)$ ? What is the value of  $V^*(B)$ ?

 $k = V^*(B) =$ 

- (b) Now assume all legal movement actions succeed with probability 0.8; with probability 0.2, the action fails and the agent remains in the same state. Consider running value iteration in gridworld G. What is the smallest iteration k for which  $V_k(A) =$  $V^*(A)$ ? What is the value of  $V^*(A)$ ?

k =

 $V^{*}(A) =$