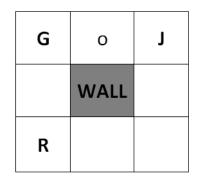
# CS221 Problem Workout Solutions

## Oct 14

# 1) [CA session] Problem 1

After finally meeting up, Romeo (R) and Juliet (J) decide to try to catch a goose (G) to keep as a pet. Eventually, they chase it into a  $3 \times 3$  hedge maze show below. Now they play the following turn-based game:

- (a) The Goose moves either Down or Right.
- (b) Romeo moves either Up or Right.
- (c) Juliet moves either Left or Down.



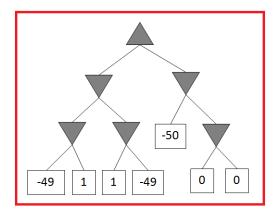
Participants: Goose (G), Romeo (R), Juliet (J), bread (o)

If the Goose enters the square with bread, it gets a reward 1. If either Romeo or Juliet enters the same square as the Goose, they catch it and the Goose gets a reward of -50. The game ends when either the Goose has been caught or everyone has moved once. Note that it is possible for the Goose to get both rewards.

Construct a depth one minimax tree for the above situation, with the Goose as the maximizer and Juliet and Romeo as the minimizers. Use up-triangles  $\Delta$  for max nodes, down-triangles  $\nabla$  for min nodes, and square nodes for the leaves. Label each node with its minimax value.

What is the minimax value of the game if Romeo defects and becomes a maximizer?

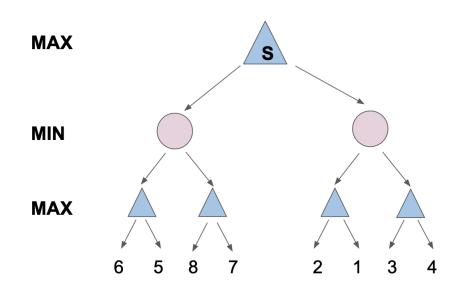
**Solution** Here is the minimax tree:



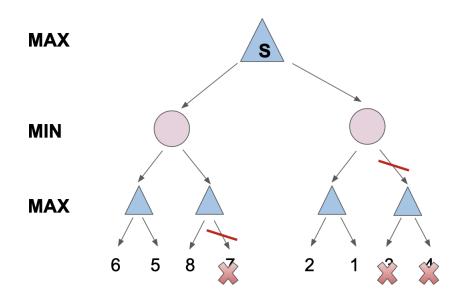
The value of the game is -49 (the goose might as well go for the bread before it gets caught). If Romeo defects, then the value of the game is 0 (the Goose moves towards Romeo).

# 2) [CA session] Problem 2

Consider running alpha-beta pruning on the following minimax tree. The children of each node will be expanded from left to right. Which nodes will be pruned (thus not being visited)?







# 3) [Breakouts] Problem 3

### Consider the speed bump problem we did last week:

You're programming a self-driving car that can take you from home (position 1) to school (position n). At each time step, the car has a current position  $x \in \{1, \ldots, n\}$  and a current velocity  $v \in \{0, \ldots, m\}$ . The car starts with v = 0, and at each time step, the car can either increase the velocity by 1, decrease it by 1, or keep it the same; this new velocity is used to advance x to the new position. The velocity is not allowed to exceed the speed limit m nor return to 0.

In addition, to prevent people from recklessly cruising down Serra Mall, the university has installed speed bumps at a subset of the *n* locations. The speed bumps are located at  $B \subseteq \{1, \ldots, n\}$ . The car is not allowed to enter, leave, or pass over a speed bump with velocity more than  $k \in \{1, \ldots, m\}$ . Your goal is to arrive at position *n* with velocity 1 in the smallest number of time steps.

#### Now let's add more information to this problem:

The university wants to remove the old speed bumps and install a single new speed bump at location  $b \in \{1, ..., n\}$  to maximize the time it takes for the car to go from position 1 to n.

Let  $T(\pi, B)$  be the time it takes to get from 1 to *n* if the car follows policy  $\pi$  if speed bumps *B* are present. If  $\pi$  violates the speed limit, define  $T(\pi, B) = \infty$ .

To simplify, assume n = 6 and k = 1. Again, there is exactly one speed bump. That is,  $B = \{b\}$  with  $b \in \{1, \ldots, n\}$ .

x = 1	x = 2	x = 3	x = 4	x = 5	x = 6
home					school

Figure: The university will add a speed bump somewhere

(i) [5 points] Compute the worst case driving time, assuming you get to adapt your policy to the university's choice of speed bump location b:  $\max_b \min_{\pi} T(\pi, \{b\})$ . What values of b attain the maximum?

**Solution** Note that with n = 6, there are only two places where one can travel at a velocity of 2, from 2 to 4 or 3 to 5; in these cases, there can't be any speed bumps there. So if the speed bump is placed at  $b \in \{1, 2, 5, 6\}$ , the optimal policy has space to speed up to a velocity of 2 around the bump, so the total time is 4. However, if the speed bump is placed at  $b \in \{3, 4\}$ , then the optimal policy is to travel at a velocity of 1 the whole way which results in a total time of [5], which is the worst case. Most common

error was missing one of the cases for b. Also, there were a number of off-by-one errors (takes only 5 units to get from 1 to 6, not 6).

(ii) [5 points] Compute the best possible time assuming that you have to choose your policy before the university chooses the speed bump:  $\min_{\pi} \max_{b} T(\pi, \{b\})$ . Make sure to explain your reasoning.

**Solution** If we choose any policy that has velocity of 2, the university can place the speed bump in the appropriate place that results in a time of  $\infty$ . Therefore, we must choose a policy that only has velocity 1, which results in a time of 5. Students should not assume that the university will definitely place speed bumps at  $b \in \{3, 4\}$ , but it's fine to acknowledge this as a possibility in your reasoning.