

## **Learning and Decision Making 2016-2017**

Homework 3. Partially Observable Markov Decision Problems

1. (a)

> $X = \{A \clubsuit, A \spadesuit\}$ , the first state means the opponent is holding Ace of Clubs and the second one means he's holding Ace of Diamonds.

 $A = \{GA, GA, GA, peek\}$ , the first and second actions are Guess Ace of Clubs and Ace of Diamonds respectively and the third one is peek.

Z = {OA♣, OA♠}, the possible observations are Observe Ace of Clubs and Observe Ace of Diamonds respectively.

**(b)** 

$$\bigcirc = \{ O_{Guess\ Ace\ of\ Clubs} = O_{Guess\ Ace\ of\ Diamonds} = \begin{cases} 0.5 & 0.5 \\ 0.5 & 0.5 \end{cases}, \qquad O_{Peek} = \begin{cases} 0.9 & 0.1 \\ 0.1 & 0.9 \end{cases} \}$$
 
$$\bigcirc = \{ P_{Guess\ Ace\ of\ Clubs} = P_{Guess\ Ace\ of\ Diamonds} = \begin{cases} 0.5 & 0.5 \\ 0.5 & 0.5 \end{cases}, \qquad P_{Peek} = \begin{cases} 1.0 & 0.0 \\ 0.0 & 1.0 \end{cases} \}$$

$$C = \begin{cases} 1.0 & 0.0 & 0.5 \\ 0.0 & 1.0 & 0.5 \end{cases}$$

(c)

The initial belief is that the opponent has an ace of clubs with probability 0.7 which means that the distribution for that belief is [0.7, 0.3].

The agent decides to peek and observes an ace of diamonds, which means that the agent performs the action "peek" and receives the observation OA♦.

Using the forward algorithm:

$$\begin{split} \mu_0 &= \begin{bmatrix} 0.7 & 0.3 \end{bmatrix} \,. \\ Z_{1:1} &= \{ \text{ OA} \blacklozenge \} \\ \alpha_0 &= \mu_0^T \\ \alpha_1 &= \text{diag}(O_1) * P^T * \alpha_0 = \begin{matrix} 0.1 & 0.0 \\ 0.0 & 0.9 \end{matrix} * \begin{matrix} 1.0 & 0.0 \\ 0.0 & 1.0 \end{matrix} * \begin{matrix} 0.7 \\ 0.3 \end{matrix} = \begin{matrix} 0.07 \\ 0.27 \end{split} \\ \text{Normalizing: } \alpha_1 &= \begin{matrix} 0.206 \\ 0.794 \end{matrix} \end{split}$$

Which means the the belief of the agent after action peek and observation OA♦ is the distribution:

Belief = 
$$[0.206, 0.794]$$