

# Planning Lab - Lesson 4

## Reinforcement Learning (RL)

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# Start Your Working Environment

Start the previously installed (lesson 1) conda environment *planning-lab*

```
> cd Planning-Lab  
> conda activate planning-lab  
> jupyter notebook
```

To open the assignment navigate with your browser to:  
    [lesson\\_4/lesson\\_4\\_problem.ipynb](#)

# Assignments

- Your assignments for this lesson are at: *lesson\_4/lesson\_4\_problem.ipynb*. You will be required to implement Q-Learning and SARSA algorithms
- In the following you can find the pseudocode

# Q-Learning

**Input:** *environment*  $[A, S]$ , *problem*, *episodes*,  $\alpha, \gamma$ , *expl\_func*, *expl\_param*

**Output:** *policy*, *rewards*, *lengths*

```
1:  $\forall a \in A, \forall s \in S$  initialize  $Q(s, a)$  arbitrarily
2:  $rewards, lengths \leftarrow [0, \dots, 0]$  ▷ Null vectors of length episodes
3: for  $i \leftarrow 0$  to episodes do
4:   Initialize  $s$ 
5:   repeat
6:      $a \leftarrow \text{EXPL\_FUNC}(Q, s, \text{expl\_param})$ 
7:      $s', r \leftarrow \text{take action } a \text{ from state } s$  ▷ Act and observe
8:      $Q(s, a) \leftarrow Q(s, a) + \alpha(R + \gamma \max_{a' \in A_s} Q(s', a') - Q(s, a))$  ▷ TD
9:      $s \leftarrow s'$ 
10:   until  $s$  is terminal
11:   Update  $rewards, lengths$ 
12:  $\pi \leftarrow [0, \dots, 0]$  ▷ Null vector of length  $|S|$ 
13: for each  $s$  in  $S$  do ▷ Extract policy
14:    $\pi_s \leftarrow \arg\max_{a \in A_s} Q(s, a)$ 
15: return  $\pi, rewards, lengths$ 
```

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```

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6:   repeat
7:      $s', r \leftarrow$  take action  $a$  from state  $s$  ▷ Act and observe
8:      $a' \leftarrow \text{EXPL\_FUNC}(Q, s', \text{expl\_param})$ 
9:      $Q(s, a) \leftarrow Q(s, a) + \alpha(R + \gamma Q(s', a') - Q(s, a))$  ▷ TD
10:     $s \leftarrow s'$ 
11:     $a \leftarrow a'$ 
12:   until  $s$  is terminal
13:   Update  $\text{rewards}, \text{lengths}$ 
14:  $\pi \leftarrow [0, \dots, 0]$  ▷ Null vector of length  $|S|$ 
15: for each  $s$  in  $S$  do ▷ Extract policy
16:    $\pi_s \leftarrow \underset{a \in A_s}{\text{argmax}} Q(s, a)$ 
17: return  $\pi, \text{rewards}, \text{lengths}$ 

```