

# Implementing Reinforcement Systems

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# Module Overview



**Understand reinforcement learning systems**

**Implementation of a simple reinforcement learning system**

**Introduce Markov decision process (MDP) and Policy-based Agents**

**Discuss additional learning tools and next steps for further learning**



# Understanding Reinforcement Learning

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# Reinforcement Learning

A learning system concerned with how an agent should take actions in an environment in order to maximize some reward.



# Reinforcement Learning



# Supervised / Unsupervised vs. Reinforcement

## Supervised / Unsupervised Learning

Objective is to predict, classify or simply some data

Environment is known (inputs known)

Train models by finding patterns in data

## Reinforcement Learning

Objective is to choose the best actions that will give the best rewards

Environment is unknown

Train models by exploring the environment to determine rewards



# Implementing a Simple Reinforcement Learning System

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# Multi-armed Bandit



Common problem: Slot machines have different winning probabilities

Each machine you can win (positive reward) or lose (negative reward)

How can you (the agent) find out which machine is best?





# Policy

Defines the agents way of behaving within the environment. The mapping from of an environment including all actions and states.



# Policy Gradient Method

Reinforcement learning technique that optimizes a policy using gradient descent methods.



# Epsilon-greedy Policy

The best lever is selected for a proportion of  $(1 - \varepsilon)$  of the trials, and a lever is selected at random for a proportion  $\varepsilon$ .



# Understanding Markov Decision Process and Reinforcement Policies

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# Markov Decision Process (MDP)

A process for modeling your full environment where the outcomes are partly random and partly under the control of a decision maker.



# Markov Decision Process

Set of states	$S$



# Markov Decision Process

<b>Set of states</b>	$S$
<b>Set of actions</b>	$A$



# Markov Decision Process

<b>Set of states</b>	$S$
<b>Set of actions</b>	$A$
<b>Probability of transition from state <math>s</math> to <math>s'</math></b>	$P_a(s, s') = P(s_{t+1} = s'   s_t = s, a_t = a)$





# Markov Decision Process

<b>Set of states</b>	$S$
<b>Set of actions</b>	$A$
<b>Probability of transition from state <math>s</math> to <math>s'</math></b>	$P_a(s, s') = P(s_{t+1} = s'   s_t = s, a_t = a)$
<b>Reward</b>	$R_a(s, s')$



# Markov Decision Process

<b>Set of states</b>	$S$
<b>Set of actions</b>	$A$
<b>Probability of transition from state <math>s</math> to <math>s'</math></b>	$P_a(s, s') = P(s_{t+1} = s'   s_t = s, a_t = a)$
<b>Reward</b>	$R_a(s, s')$
<b>Discount factor</b>	$\gamma \in [0, 1)$



# Further Learning and Next Steps

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# Further Learning



## **Tensorflow website ([tensorflow.org](https://www.tensorflow.org))**

- Tutorials, videos, documentation

## **Pluralsight courses**

- Building Classification Models with TensorFlow
- Understanding Algorithms for Reinforcement Learning

## **OpenAI gym toolkit for reinforcement learning environments**

# Summary



Understood and implemented supervised learning systems

Implemented a movie recommendation learning system

Understood and implemented a simple reinforcement learning system

Discussed additional learning tools and next steps for further learning

