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Insights

Implementation of Reinforcement Learning Algorithms. Python, OpenAI Gym, Tensorflow. Exercises and Solutions to accompany Sutton's Book and David Silver's course. <http://www.wildml.com/2016/10/learnin...>

176 commits

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<b>dennybritz</b> committed on <b>GitHub</b> Merge pull request <a href="#">#102</a> from sstarzycki/patch-1	Latest commit 762f34c Jul 21, 2017
<a href="#">DP</a>	Update description of env.P[s][a] Jul 21, 2017
<a href="#">DQN</a>	DQN copy_model_parameters memory leak fixed, tensorboard summaries up... Jul 8, 2017
<a href="#">FA</a>	correct more typos Jul 6, 2017
<a href="#">Introduction</a>	Merge branch 'master' of github.com:dennybritz/reinforcement-learning Jun 12, 2017
<a href="#">MC</a>	Merge branch 'master' of github.com:dennybritz/reinforcement-learning Jun 12, 2017
<a href="#">MDP</a>	Merge branch 'master' of github.com:dennybritz/reinforcement-learning Jun 12, 2017
<a href="#">PolicyGradient</a>	Remove unused line Jun 17, 2017
<a href="#">TD</a>	Update book link Jun 12, 2017
<a href="#">lib</a>	fix typo Mar 14, 2017
<a href="#">.gitignore</a>	Deep Q Updates Sep 18, 2016
<a href="#">LICENSE</a>	Add MIT License Oct 3, 2016
<a href="#">README.md</a>	Merge branch 'master' of github.com:dennybritz/reinforcement-learning Jun 12, 2017
<a href="#">__init__.py</a>	Add MC Control with Epsilon-Greedy Policies Sep 1, 2016

**README.md**

## Overview

This repository provides code, exercises and solutions for popular Reinforcement Learning algorithms. These are meant to serve as a learning tool to complement the theoretical materials from

- [Reinforcement Learning: An Introduction \(2nd Edition\)](#)
- [David Silver's Reinforcement Learning Course](#)

Each folder in corresponds to one or more chapters of the above textbook and/or course. In addition to exercises and solution, each folder also contains a list of learning goals, a brief concept summary, and links to the relevant readings.

All code is written in Python 3 and uses RL environments from [OpenAI Gym](#). Advanced techniques use [Tensorflow](#) for neural network implementations.

## Table of Contents

- [Introduction to RL problems & OpenAI Gym](#)
- [MDPs and Bellman Equations](#)
- [Dynamic Programming: Model-Based RL, Policy Iteration and Value Iteration](#)
- [Monte Carlo Model-Free Prediction & Control](#)
- [Temporal Difference Model-Free Prediction & Control](#)

- [Function Approximation](#)
- [Deep Q Learning](#) (WIP)
- [Policy Gradient Methods](#) (WIP)
- [Learning and Planning](#) (WIP)
- [Exploration and Exploitation](#) (WIP)

List of Implemented Algorithms

- [\[Dynamic Programming Policy Evaluation\]\(DP/Policy Evaluation Solution.ipynb\)](#)
- [\[Dynamic Programming Policy Iteration\]\(DP/Policy Iteration Solution.ipynb\)](#)
- [\[Dynamic Programming Value Iteration\]\(DP/Value Iteration Solution.ipynb\)](#)
- [\[Monte Carlo Prediction\]\(MC/MC Prediction Solution.ipynb\)](#)
- [\[Monte Carlo Control with Epsilon-Greedy Policies\]\(MC/MC Control with Epsilon-Greedy Policies Solution.ipynb\)](#)
- [\[Monte Carlo Off-Policy Control with Importance Sampling\]\(MC/Off-Policy MC Control with Weighted Importance Sampling Solution.ipynb\)](#)
- [\[SARSA \(On Policy TD Learning\)\]\(TD/SARSA Solution.ipynb\)](#)
- [\[Q-Learning \(Off Policy TD Learning\)\]\(TD/Q-Learning Solution.ipynb\)](#)
- [\[Q-Learning with Linear Function Approximation\]\(FA/Q-Learning with Value Function Approximation Solution.ipynb\)](#)
- [\[Deep Q-Learning for Atari Games\]\(DQN/Deep Q Learning Solution.ipynb\)](#)
- [\[Double Deep-Q Learning for Atari Games\]\(DQN/Double DQN Solution.ipynb\)](#)
- [Deep Q-Learning with Prioritized Experience Replay](#) (WIP)
- [\[Policy Gradient: REINFORCE with Baseline\]\(PolicyGradient/CliffWalk REINFORCE with Baseline Solution.ipynb\)](#)
- [\[Policy Gradient: Actor Critic with Baseline\]\(PolicyGradient/CliffWalk Actor Critic Solution.ipynb\)](#)
- [\[Policy Gradient: Actor Critic with Baseline for Continuous Action Spaces\]\(PolicyGradient/Continuous MountainCar Actor Critic Solution.ipynb\)](#)
- [Deterministic Policy Gradients for Continuous Action Spaces](#) (WIP)
- [Deep Deterministic Policy Gradients \(DDPG\)](#) (WIP)
- [Asynchronous Advantage Actor Critic \(A3C\)](#)

Resources

Textbooks:

- [Reinforcement Learning: An Introduction \(2nd Edition\)](#)

Classes:

- [David Silver's Reinforcement Learning Course \(UCL, 2015\)](#)
- [CS294 - Deep Reinforcement Learning \(Berkeley, Fall 2015\)](#)
- [CS 8803 - Reinforcement Learning \(Georgia Tech\)](#)

Talks/Tutorials:

- [Introduction to Reinforcement Learning \(Joelle Pineau @ Deep Learning Summer School 2016\)](#)
- [Deep Reinforcement Learning \(Pieter Abbeel @ Deep Learning Summer School 2016\)](#)
- [Deep Reinforcement Learning ICML 2016 Tutorial \(David Silver\)](#)
- [Tutorial: Introduction to Reinforcement Learning with Function Approximation](#)
- [John Schulman - Deep Reinforcement Learning \(4 Lectures\)](#)
- [Deep Reinforcement Learning Slides @ NIPS 2016](#)

Other Projects:

- [carpedm20/deep-rl-tensorflow](#)
- [matthiasplappert/keras-rl](#)

Selected Papers:

- [Human-Level Control through Deep Reinforcement Learning \(2015-02\)](#)
- [Deep Reinforcement Learning with Double Q-learning \(2015-09\)](#)
- [Continuous control with deep reinforcement learning \(2015-09\)](#)
- [Prioritized Experience Replay \(2015-11\)](#)

- [Dueling Network Architectures for Deep Reinforcement Learning \(2015-11\)](#)
- [Asynchronous Methods for Deep Reinforcement Learning \(2016-02\)](#)
- [Deep Reinforcement Learning from Self-Play in Imperfect-Information Games \(2016-03\)](#)
- [Mastering the game of Go with deep neural networks and tree search](#)