

# RL seminar #1: Intro to RL & admin stuff

Maksim Kreto

MIPT, Deep learning lab & iPavlov.ai

14 Oct 2017

# Outline

## Class information

- Logistics

- Course outline

- Assignments

- References

## RL introduction

## Tools

## Assignments

# Table of Contents

## Class information

Logistics

Course outline

Assignments

References

## RL introduction

## Tools

## Assignments

# Logistics

## Course goals (seminars)

To **help** studying RL: provide structure and answer questions.

## Organizer

MIPT, NN and DL Lab: <http://edu.ipavlov.ai/>

## Staff & Contacts

Maksim Kreto (kretovmk@gmail.com)

Anton Karazeev (anton.karazeev@gmail.com)

Telegram: <https://t.me/DeepRLfall2017>

Github: <https://github.com/deepmipt/deep-rl-seminars>

Real world: BFK, classroom 518.

## Default place and time

MIPT, BFK, every Saturday at 12pm starting 14 Oct 2017. In total 7-8 seminars.

# Course outline

Put topics for discussion there: <https://goo.gl/qN6jmJ>  
Write questions on the 2nd w/sheet of the same doc.

## Loose plan

1. Intro to RL  $\leftarrow$  TODAY.
2. MDP, Bellman equations.
3. Value-based methods.
4. Policy gradient I-II.
5. Stochastic computational graphs I-II.

## Typical seminar

I tell something relevant to current lectures (NOT reproduction of other courses' slides); we discuss questions and assignments.

# Assignments

## Scoring system for "zachet"

50%: 3 home assignments (coding, 10p) and 5 quizzes (google doc form, 4p). Works with high similarity score are discarded.

50%: exam at the end OR top-10 in RL competition (50p)

## Quizzes (min 1 week)

One quiz after seminar.

## Coding assignments (min 2 weeks)

HW1: PyTorch and imitation learning.

HW2-HW3: value methods and policy gradient.

# References

## Basic courses

- ▶ RL boot camp:  
<https://sites.google.com/view/deep-rl-bootcamp/>
- ▶ CS294: <http://rll.berkeley.edu/deeprlcourse/>

## Introductory courses

- ▶ CS188: <http://ai.berkeley.edu/home.html>
- ▶ David Silver's course:  
<http://www0.cs.ucl.ac.uk/staff/d.silver/web/Home.html>

## Books

- ▶ Sutton's book: <https://goo.gl/spWWVL>
- ▶ RL algorithms: <https://goo.gl/V4ppwA>

# Table of Contents

## Class information

Logistics

Course outline

Assignments

References

## RL introduction

## Tools

## Assignments



# RL introduction

## Task definition

Agent receive from environment state  $S_{t+1}$ , reward  $r_t(s_t, a_t)$  and perform action  $a_{t+1}$ , which is determined by parametrized policy  $\pi_\theta(a_t|s_t)$ . Goal is to maximize cumulative reward  $J(\theta) = \sum_{t=0}^{T-1} r_t$ .

## Cool stories about RL

Backgammon, Chess, Go, Atari, Robotics

# RL introduction

## Why RL is powerful?

- ▶ Universal – most of the tasks can be framed in RL setting
- ▶ Reward is sparse and non-differentiable

## Cooler stories about RL

RL<sup>1</sup>, Neural architectures search<sup>2</sup>, Reasoning with neural networks<sup>3</sup>

---

<sup>1</sup><https://arxiv.org/abs/1611.02779>

<sup>2</sup><https://arxiv.org/pdf/1707.04873.pdf>

<sup>3</sup><http://bair.berkeley.edu/blog/2017/06/20/learning-to-reason-with-neural-module-networks/>

# RL introduction

## MDP and POMDP

Directed and undirected graphical models.

Observations and states: MDP and POMDP.

## Imitation learning

Questions?

# Table of Contents

## Class information

Logistics

Course outline

Assignments

References

## RL introduction

## Tools

## Assignments

## PyTorch

- ▶ Dynamic computational graphs<sup>4</sup>
- ▶ Dynamic batching<sup>5</sup>
- ▶ Fast and clear

Implementation of REINFORCE or A2C takes about 100 lines of code, including imports and args parsing (see examples in repo<sup>6</sup>). Many more complicated algorithms already implemented<sup>7</sup>.

---

<sup>4</sup><http://pytorch.org/tutorials/>

<sup>5</sup><https://medium.com/@ilblackdragon/pytorch-dynamic-batching-f4df3dbe09ef>

<sup>6</sup>[https://github.com/pytorch/examples/tree/master/reinforcement learning](https://github.com/pytorch/examples/tree/master/reinforcement%20learning)

<sup>7</sup><https://github.com/ikostrikov>

# Table of Contents

## Class information

Logistics

Course outline

Assignments

References

## RL introduction

## Tools

## Assignments

# Assignments

## Reading

Lectures 2-4 of CS294.

Please, let us know about your questions: google doc, e-mail, telegram.

## Doing

Quiz and home assignment are coming.