

Hands-on Project

Matteo Saveriano

Human-centered Assistive Robotics

Technische Universität München

Hands-on Project

Arrange groups of three students (S1, S2, S3)

Task for each group:

- Implement 3 models (S1+S2+S3)
- Implement a model-based RL approach (S1)
- Implement a model-free approach (S2)
- Implement an approach based on optimal control OR on deep RL (S3)
- Each student is allowed to propose a creative solution
- Compare the performance of the approaches (S1+S2+S3)

Report

Structure:

- Sec. 1: Introduction (Max 5 sentences) ($S1 + S2 + S3$)
- Sec. 2: Model-based RL ($S1$)
 - 2.1 Algorithm
 - 2.2 Results
- Sec. 3: Model-free RL ($S2$)
 - 3.1 Algorithm
 - 3.2 Results
- Sec. 4: Optimal Control / Deep RL ($S3$)
 - ...
- Sec. 5: Comparison and Discussion ($S1 + S2 + S3$)
- Sec. 6: Conclusion (Max 5 sentences) ($S1+S2+S3$)
- Max 4 pages – ICRA template

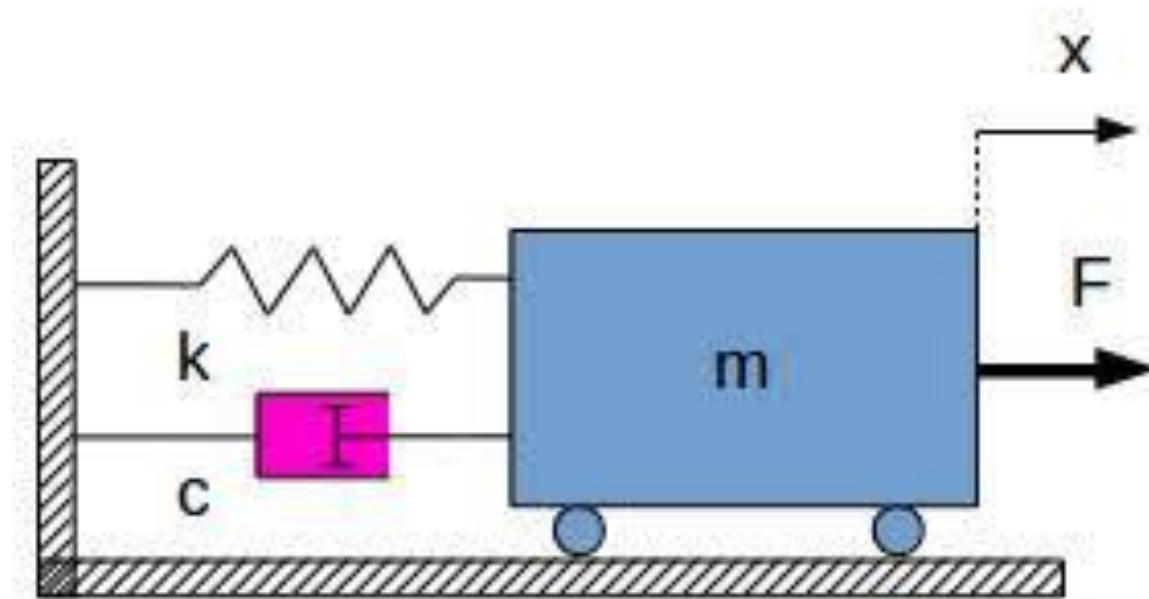
Hands-on Project

- Three different systems and learning problems
- For each system, apply three approaches and compare the results
- Besides this, you are free to propose creative solutions with more complex problems



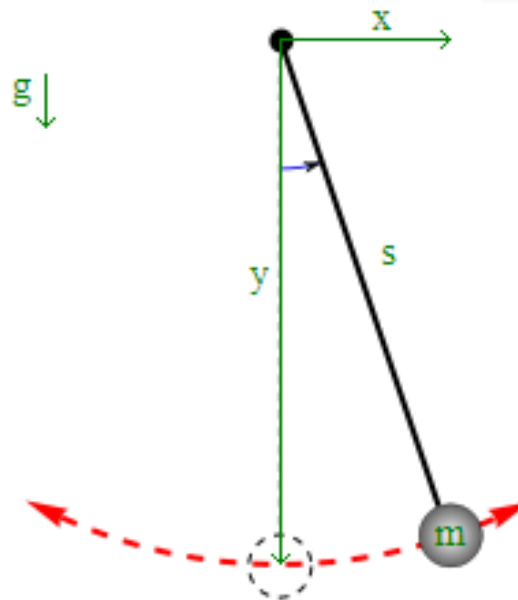
Mass-Spring-Damper

- System data: $m = 1\text{kg}$, $k = 1\text{N/m}$, $c = 0\text{Ns/m}$
- Bring the system to 1.5m
- Compare different approaches



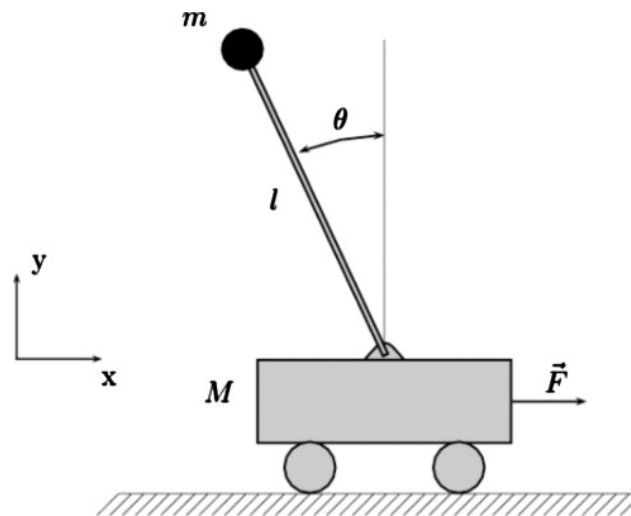
Inverted pendulum

- Balance the pendulum in the upper vertical position
 $\theta(t_f) = \pi$, with $\theta(0) = 0, \dot{\theta}(0) = 0$
- A motor provides the torque \mathcal{T}
- $m = 1Kg, s = 1m, c = 0.2Ns/m$



Cartpole

- Parameter of the system $m=0.2$ kg, $M=1$ kg, $l=0.5$ m, $c=0.2$ Ns/m
- Balance the pendulum on the vertical position
- Try different initial angles
 $\theta_0 = 10$ deg, $\theta_0 = 180$ deg, $\theta_0 = 90$ deg



If you want to do more

- MuJoCo Engine – free for educational projects:
<https://www.roboti.us/index.html>

- Tensor Flow, tool for deep networks:
<https://www.tensorflow.org/tutorials/>

- OpenAI Gym

<https://arxiv.org/abs/1606.01540>



Why you are asked to model systems

- Modeling and simulating the systems is part of the project
- In general, it is fine to use tools to model complex systems
- It is important to know how to model (simple) systems
- Without modeling skills, intuition about the physics does not usually develop



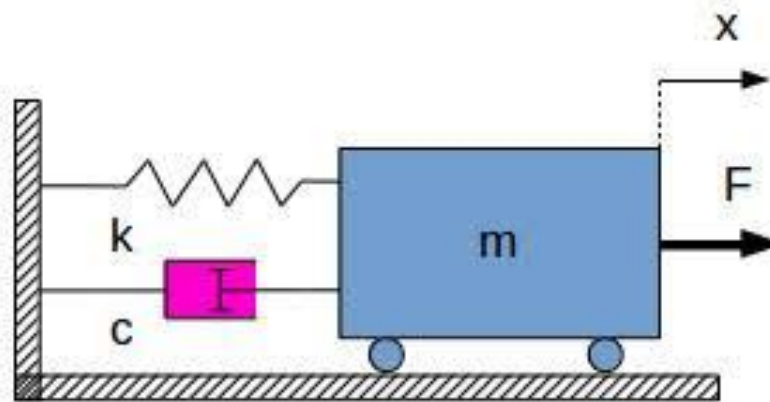
Evaluation of Learning Algorithms

- Discuss in the report the comparative performance of the different algorithms
- Some criteria commonly used...
 - Accuracy
 - Number of Interactions with external world
 - Data Required for learning
 - Learning time
 - Prior knowledge required
 - Control Energy



Exercise 1

- Use the PILCO algorithm to find a controller that brings the state of the system used in the last lesson at $x=0.6\text{m}$
- Design a suitable Reward Function
- Choose a suitable policy representation
- Assess the performance in terms of number of rollouts, control energy, and accuracy



Exercise 2 (optional)

- Use PILCO to find a policy that brings the mass in the unstable equilibrium state
- The system start from the stable equilibrium state
- Define a reward function and select a policy representation

