

# 16-745: Optimal Control and Reinforcement Learning

Spring 2021

## Course Description

This is a course about how to make robots move through and interact with their environment with speed, efficiency, and robustness. We will survey a broad range of topics from nonlinear dynamics, linear systems theory, classical optimal control, numerical optimization, state estimation, system identification, and reinforcement learning. The goal is to provide students with hands-on experience applying each of these ideas to a variety of robotic systems so that they can use them in their own research.

**Prerequisites:** Strong linear algebra skills, experience with a high-level programming language like Python, MATLAB, or Julia, and basic familiarity with ordinary differential equations.

## Instructors

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## Logistics

- Lectures will be held Tuesdays and Thursdays 6:00–7:20 PM Eastern time on Zoom.
- Office hours will be **TODO: based on survey**.
- Homework assignments will be due by 11:59 PM Eastern time on Wednesdays. Two weeks will be given to complete each assignment.
- GitHub will be used to distribute and collect assignments.
- Slack will be used for general discussion and Q&A outside of class and office hours.
- There will be no exams. Instead, each student will complete a project on a topic of their choice.

## Learning Objectives

By the end of this course, students should be able to do the following:

1. Analyze the stability of dynamical systems
2. Design LQR controllers that stabilize equilibria and trajectories

3. Use offline trajectory optimization to design trajectories for nonlinear systems
4. Use online convex optimization to implement model-predictive control
5. Understand the effects of stochasticity and model uncertainty
6. Directly optimize feedback policies when good models are unavailable

## Learning Resources

There is no textbook required for this course. Video recordings of lectures and lecture notes will be posted online. Additional references for further reading will be provided with each lecture.

## Homework

Homework will be posted every 2 weeks and students will be given at least one full week to complete assignments. All homework will be distributed and collected using GitHub. Solutions and grades will be returned within one week of homework due dates.

## Project Guidelines

Students should work in groups of 1–4 to complete a substantial final project. The goal is for students to apply the course content to their own research. Project proposals will be solicited in March and topics will be selected in consultation with the instructors.

Project grades will be based on a short presentation given during the last week of class and a final report submitted by May 14. Reports should be written in the form of a 6–8 page conference paper using the standard [two-column IEEE format](#).

## Grading

Grading will be based on:

- 60% Project
- 30% Homeworks
- 10% Participation

Attendance during lectures is not required to earn a full participation grade. Students can also participate through any combination of office hours, Slack discussions, project presentations, and by offering constructive feedback about the course to the instructors.

## Course Policies

**Late Homework:** Students are allowed a budget of 2 late days for turning in homework with no penalty throughout the semester. They may be used together on one assignment, or separately on two assignments. Beyond these two days, no other late homework will be accepted.

**Accommodations for Students with Disabilities:** If you have a disability and are registered with the Office of Disability Resources, I encourage you to use their online system to notify me of your accommodations and discuss your needs with me as early in the semester as possible. I will work with you to ensure that accommodations are provided as appropriate. If you suspect that you may have a disability and would benefit from accommodations but are not yet registered with the Office of Disability Resources, I encourage you to contact them at [access@andrew.cmu.edu](mailto:access@andrew.cmu.edu).

**Statement of Support for Students' Health & Well-Being:** Take care of yourself. Do your best to maintain a healthy lifestyle this semester by eating well, exercising, avoiding drugs and alcohol, getting enough sleep, and taking some time to relax. This will help you achieve your goals and cope with stress.

If you or anyone you know experiences any academic stress, difficult life events, or feelings like anxiety or depression, we strongly encourage you to seek support. Counseling and Psychological Services (CaPS) is here to help: call 412-268-2922 and visit <http://www.cmu.edu/counseling>. Consider reaching out to a friend, faculty, or family member you trust for help getting connected to the support that can help.

*If you or someone you know is feeling suicidal or in danger of self-harm, call someone immediately, day or night:*

*CaPS: 412-268-2922*

*Re:solve Crisis Network: 888-796-8226*

*If the situation is life threatening, call the police:*

*On campus: CMU Police: 412-268-2323*

*Off campus: 911*

If you have questions about this or your coursework, please let me know. Thank you, and have a great semester.

## Tentative Schedule

Week	Dates	Topics	Assignments
1	Feb 2 Feb 4	Course Overview, Dynamics Intro Discrete-Time Dynamics	Survey
2	Feb 9 Feb 11	Optimization Intro Unconstrained Numerical Optimization	HW 1 Out
3	Feb 16 Feb 18	Constrained Numerical Optimization Linear Systems & LQR	
4	Feb 23 Feb 25	<b>No Class</b> LQR as a QP and the Riccati Equation	HW 1 Due HW 2 Out
5	Mar 2 Mar 4	Dynamic Programming Convex MPC	
6	Mar 9 Mar 11	Nonlinear Trajectory Optimization & DDP DDP with Constraints	HW2 Due HW3 Out
7	Mar 16 Mar 18	Direct Collocation & SQP Floating Base Systems & Attitude	
8	Mar 23 Mar 25	Optimization with Quaternions Contact Intro	
9	Mar 30 Apr 1	Hybrid Trajectory Optimization for Legged Systems <b>No Class</b>	HW3 Due
10	Apr 6 Apr 8	Model Uncertainty: Iterative Learning Control Stochastic Optimal Control and LQG	HW4 Out
11	Apr 13 Apr 15	Approximate DP: Learning Value Functions <b>No Class</b>	
12	Apr 20 Apr 22	Optimal Control in the Wild: SpaceX & JPL Optimal Control in the Wild: Legged Robots	HW4 Due
13	Apr 27 Apr 29	Optimal Control in the Wild: Autonomous Driving Optimal Control in the Wild: TBD	
14	May 4 May 6	Project Presentations Project Presentations	