# Convex Optimization and Game Theory (online)

# **Dates and time**

17-05; 31-05; 07-06; 14-06 2021 from 13.45-16.00

## **Course location**

Online course

## ECTS

3 ECTS if the homework is completed successfully. For online courses it is not possible to get credits for auditing

### Lecturers

Dr. ing. S. Grammatico, Delft University of Technology Dr. P. Mohajerin Esfahani, Delft University of Technology

## **Objective**

The aim of the course is to introduce the mathematical tools for analyzing and designing (distributed) algorithms for solving (multi-agent) convex optimization problems and game equilibrium problems. The selected mathematical tools are within linear algebra, system theory, fixed point and monotone operator theory.

## Contents

#### Lecture 1: Convex analysis

Convex sets, (strictly, strongly) convex functions, indicator functions. Set-valued mappings, normal cone operator and tangent cone operator. Subdifferential mapping. Projection operator, proximal operator.

Reference material: textbooks [3, 1].

#### Lecture 2: Monotone operator theory

Elements of operator theory: fixed points, zeros, contraction, averaged and nonexpansive mappings. Fixed point algorithms: Picard-Banach iteration, Krasnoselskij-Mann iteration. Zero-finding algorithms: monotone operator splitting, forward-backward algorithm. Reference material: textbook [1], survey [4].

#### Lecture 3: Convex optimization

Lagrangian duality, KKT system, KKT inclusion. First-order, second-order and accelerated, algorithms. Distributed optimization algorithms. Alternating direction method of multipliers (ADMM). Reference material: textbooks [2], [3, 1], survey [4].

#### Lecture 4: Monotone game theory

Nash equilibrium problem, best response mapping, variational inequality. Generalized Nash equilibrium problem, preconditioned forward-backward equilibrium seeking, forward-reflected-

backward equilibrium seeking. Reference material: textbooks [3, 1].

## **Course materials**

[1] H. H. Bauschke and P. L. Combettes. Convex analysis and monotone operator theory in Hilbert spaces. Springer, 2010.

[2] S. Boyd and L. Vandenberghe. Convex Optimization. Cambridge University Press, 2009.

[3] R.T. Rockafellar and R.J.B. Wets. Variational Analysis. Springer, 1998.

[4] E. K. Ryu and S. Boyd. A primer on monotone operator methods. Appl. Compt. Math., 15(1), 2016.

### **Prerequisites**

The prerequisite knowledge consists of linear algebra, calculus and optimization at a graduate level.

### **Homework assignments**

Graded take-home exam: mathematical proofs and numerical simulations.