

## TMA947 Optimization, first course, 7.5 credits MMG620 Optimization, 7.5 credits

The purpose of this basic course in optimization is to provide

- (I) knowledge of some important classes of optimization problems and of application areas of optimization modelling and methods;
- (II) practice in describing relevant parts of a real-world problem in a mathematical optimization model;
- (III) an understanding of necessary and sufficient optimality criteria, of their consequences, and of the basic mathematical theory upon which they are built;
- (IV) examples of optimization algorithms that are naturally developed from this theory, their convergence analysis, and their application to practical optimization problems.

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**LECTURER/EXERCISE ASSISTANT/PROJECT MANAGER:** Adam Wojciechowski, Tek. Lic., Ph. D. student, Matematiska Vetenskaper, room 2099; tel: 772 5352; e-mail: wojcadam@chalmers.se

**EXERCISE ASSISTANT:** Emil Gustavsson, Ph. D. student, Matematiska Vetenskaper, room 2085; tel: 772 5372; e-mail: emilg@chalmers.se

### Course presentation

**CONTENTS:** The main focus of the course is on optimization problems in continuous variables; it builds a foundation for the analysis of an optimization problem. We can roughly separate the material into the following areas:

**Convex analysis:** convex set, polytope, polyhedron, cone, representation theorem, extreme point, separation theorem, Farkas Lemma, convex function

**Optimality conditions and duality:** global/local optimum, existence and uniqueness of optimal solutions, variational inequality, Karush–Kuhn–Tucker (KKT) conditions, complementarity conditions, Lagrange multiplier, Lagrangian dual problem, global optimality conditions, weak/strong duality

**Linear programming (LP):** LP models, LP algebra and geometry, basic feasible solution (BFS), the Simplex method, termination, LP duality, optimality conditions, strong duality, complementarity, interior point methods, sensitivity analysis

**Nonlinear optimization methods:** direction of descent, (quasi-)Newton method, Frank–Wolfe method, gradient projection, exterior and interior penalty, sequential quadratic programming

We also touch upon other important problem areas within optimization, such as integer programming and network optimization.

**PREREQUISITES:** Passed courses on analysis (in one and several variables) and linear algebra; familiarity with matrix/vector notation and calculus, differential calculus. Reading Chapter 2 in the book (i) below provides a partial background, especially to the mathematical notation used and most of the important basic mathematical terminology.

**ORGANIZATION:** Lectures, exercises, a project assignment, and computer exercises.

**COURSE LITERATURE:**

- (i) *An Introduction to Optimization* by N. Andréasson, A. Evgrafov, and M. Patriksson, published by Studentlitteratur in 2005 and found in the Cremona book store
- (ii) Hand-outs from books and articles

**COURSE REQUIREMENTS:** The course content is defined by the literature references in the plan below.

**EXAMINATION:**

- Written exam (first opportunity 12/12, 8.30–13.30, V building)—gives 6 credits
- Project assignment—gives 1.5 credits
- Two correctly solved computer exercises

**SCHEDULE:**

**Lectures:** on Wednesdays 13.15–15.00 and Fridays 8.00–9.45. *Exceptions: Lecture 2 follows immediately after Lecture 1, on 26/10 15.15–17.00.* Lectures are given in English. For locations, see the schedule below.

**Exercises:** on Wednesdays 15.15–17.00 and Fridays 10.00–11.45 in two parallel groups: (I) exercises in Swedish (Emil); (II) exercises in English (Adam). *Exception both for (I) and (II): no exercise 26/10 (see above).* For locations, see the schedule below.

**Project:** Teachers are available for questions in the computer rooms, which are also booked for work on the project, on 24/11 (rooms: MV:F24, MV:F25) at 15.15–19.00. (Presence is not obligatory.) At other times, work is done individually. Deadline for handing in the project model: 8/11. Hand-out of correct AMPL model: 21/11. Deadline for handing in the project report: 5/12.

**Computer exercises:** The computer exercise are scheduled to take place when also teachers are available, on 17/11 and 1/12, respectively (room booked: MV:F25), and on both occasions at 15.15–19.00. (Presence is not obligatory.) The computer exercises can be performed individually, but preferably in groups of two (and *strictly not* more than two). Deadline for handing in the report, unless passed through oral examination on site during the scheduled sessions: one week following each computer exercise.

*Important note:* The computer exercises *require* at least one hour of preparation each; having done that preparation, two–three hours should be enough to complete an exercise by the computer.

Information about the project and computer exercises are found on the web page <https://pingpong.gate.chalmers.se/courseId/1246/content.do?id=681116>.

This course information, the course literature, project and computer exercise materials, most hand-outs and previous exams will also be found on this page.

## **COURSE PLAN, LECTURES:**

**Le 1 (26/10)** [Euler, Physics building] *Course presentation.* Subject description. Course map. Applications. **Week 1**

*Optimization modelling.* Modelling. Problem analysis. Classification.

(i): Chapter 1, 2

**Le 2 (26/10)** [Euler, Physics building] *Convexity.* Convex sets and functions. Polyhedra. The Representation Theorem. Separation. Farkas Lemma.

(i): Chapter 3

**Le 3 (28/10)** [Euler, Physics building] *Optimality conditions, introduction.* Local and global optimality. Existence of optimal solutions. Feasible directions. Necessary and sufficient conditions for local or global optimality when the feasible set is convex.

(i): Chapter 4.1–4.3

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**Le 4 (2/11)** [Euler, Physics building] *Unconstrained optimization methods.* Search directions. Line searches. Termination criteria. Steepest descent. Derivative-free methods. **Week 2**

(i): Chapter 11

(ii): Material on derivative-free optimization

**Le 5 (4/11)** [Euler, Physics building] *Optimality conditions, continued.* Necessary and sufficient conditions for local or global optimality when the feasible set is convex, continued.

*The Karush–Kuhn–Tucker conditions.* Introduction to the primal–dual optimality conditions (KKT).

(i): Chapter 4.4–, 5.1–5.4

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**Le 6 (10/11)** [Euler, Physics building] *The Karush–Kuhn–Tucker conditions, continued.* Constraint qualifications. The Fritz–John conditions. The Karush–Kuhn–Tucker conditions: necessary and sufficient conditions for local or global optimality. **Week 3**

(i): Chapter 5

**Le 7 (11/11)** [Euler, Physics building] *Convex duality.* The Lagrangian dual problem. Weak and strong duality. Getting the primal solution.

(i): Chapter 6

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**Le 8 (16/11)** [Euler, Physics building] *Linear programming*. Introduction to linear programming. Modelling. Basic feasible solutions and extreme points (algebra versus geometry in linear programming). The simplex method, introduction.  
(i): Chapter 7, 8 **Week 4**

**Le 9 (18/11)** [Euler, Physics building] *Linear programming, continued*. The Simplex method. The revised Simplex method. Phase I and II. Degeneracy. Termination. Complexity.  
(i): Chapter 9

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**Le 10 (23/11)** [Pascal, Math building] *Linear programming, continued*. Optimality. Duality. Sensitivity analysis.  
(i): Chapter 10 **Week 5**

**Le 11 (25/11)** [Euler, Physics building] *Linear programming, continued*. Sensitivity analysis, continued.  
*Integer programming*. Applications. Modelling.  
(i): Chapter 10  
(ii): On integer programming

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**Le 12 (30/11)** [Euler, Physics building] *Nonlinear optimization methods: convex feasible sets*. The gradient projection method. The Frank–Wolfe method. Simplicial decomposition. Applications.  
(i): Chapter 12, 6.3 **Week 6**

**Le 13 (2/12)** [Euler, Physics building] *Nonlinear optimization methods: general sets*. Penalty and barrier methods. Interior point methods for linear programming, orientation.  
(i): Chapter 13

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**Le 14 (7/12)** [Euler, Physics building] *Nonlinear optimization methods: general sets, continued*. Sequential quadratic programming, orientation. Applications of optimization algorithms. *An overview of the course*.  
(i): Chapter 13 **Week 7**

## COURSE PLAN, EXERCISES:

**Ex 1 (28/10)** [MV:F31,33] Modelling. **Week 1**  
(i): Chapter 1

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**Ex 2 (2/11)** [MV:F31,33] Convexity. Polyhedra. Separation. Optimality. **Week 2**  
(i): Chapter 3

**Ex 3 (4/11)** [MV:F31,33] Local and global minimum. Feasible sets. Optimality conditions. Weierstrass' Theorem  
(i): Chapter 4

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**Ex 4 (9/11)** [MV:F31,33] Unconstrained optimization. **Week 3**  
(i): Chapter 11

**Ex 5 (11/11)** [MV:F31,33] The KKT conditions.  
(i): Chapter 5

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**Ex 6 (16/11)** [MV:F31,33] Lagrangian duality. **Week 4**  
(i): Chapter 6

**Ex 7 (18/11)** [MV:F31,33] Geometric solution of LP problems. Standard form. The geometry of the Simplex method. Basic feasible solution.  
(i): Chapters 7, 8

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**Ex 8 (23/11)** [MV:F31,33] The Revised Simplex method. Phase I & II. **Week 5**  
(i): Chapter 9

**Ex 9 (25/11)** [MV:F31,33] Duality in linear programming. Sensitivity analysis.  
(i): Chapter 10

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**Ex 10 (30/11)** [MV:F31,33] Sensitivity analysis, continued. **Week 6**  
(i): Chapter 10  
(ii): Hand-outs

**Ex 11 (2/12)** [MV:F31,33] Algorithms for convexly constrained optimization. The Frank–Wolfe and simplicial decomposition algorithms.  
(i): Chapter 12

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**Ex 12 (7/12)** [MV:F31,33] Constrained optimization methods. Penalty methods. Repetition. **Week 7**

(i): Chapter 13