

### **Key words**

Convex sets and functions, separation, cones and polarity, polyhedral sets, extreme points and directions, subgradients, minima and maxima, support functions, the Fritz John and Karush-Kuhn-Tucker conditions, constraint qualifications, Farkas' Lemma, sensitivity analysis, Lagrangian duality, duality gap, saddle points, Lagrangian dual problem, nonsmooth optimization, decomposition, closed algorithmic maps, unconstrained optimization, line searches, gradient-based optimization methods, coordinate search, convergence rates, derivative-free optimization, penalty and barrier methods, interior point methods, feasible-direction methods.

### **Credits**

12 hp in the PhD program: 7.5 hp for the theory part, 4.5 for the algorithmic part

### **Literature**

- M S Bazaraa, H D Sherali and C M Shetty: *Nonlinear Programming: Theory and Algorithms* (Wiley, 2006) (main course book)
- D P Bertsekas: *Nonlinear Programming* (Athena, 1999) (supplementary material)
- A few selected articles (typically more recent) will also be included

### **Examination**

Exercises, oral examination and a project.

### **Project**

Implementation and evaluation of some iterative methods for nonlinear optimization.

### **Reading list by topic**

#### **Bazaraa, Sherali, & Shetty, Chapter 1: Introduction**

- Exercises: 2, 6, 12, 13
- Topics for oral exam
  - Section 1.3

#### **Bazaraa, Sherali, & Shetty, Chapter 2: Convex sets**

- Exercises: 1–2, 9, 11, 16–21, 25, 27, 29–31, 38–39, 42, 44, 46, 52–54
- Topics for oral exam
  - Theorems 2.1.6, 2.3.1, 2.4.1, 2.4.4, 2.4.5, 2.5.4, 2.6.5, 2.6.7
- Additional topic
  - Generalization of Theorem 2.4.5 to nonlinear systems

#### **Bazaraa, Sherali, & Shetty, Chapter 3: Convex functions and generalizations**

- Exercises: 9–10, 12, 14, 16–18, 20–24, 26–27, 31–33, 38, 40, 43, 45–47, 50–52, 54–57, 69
- Topics for oral exam
  - Theorems 3.1.3, 3.4.2–3.4.4, 3.4.7
  - The subdifferential
- Additional topics
  - Generalized convex functions and monotone mappings

- Generalizations of Theorem 3.4.4 (establish a similar statement for non-differentiable convex functions; re-establish Theorem 3.4.4 where  $f$  in  $C^1$  replaces  $f$  in  $C^2$ )

**Bertsekas, Chapter 2.1: Optimality conditions**

- Exercises: 1.10–1.12

**Bazaraa, Sherali, & Shetty, Chapter 4: The Fritz John and the Karush-Kuhn-Tucker optimality conditions**

- Exercises: 4, 6, 9, 12–17, 19–20, 24, 26, 29–32, 34, 37, 39, 41, 45–48
- Topics for oral exam:
  - Theorems 4.2.2, 4.2.5, 4.2.8, 4.2.13, 4.2.15, 4.2.16
  - Differences between FJ and KKT
  - Example 4.4.4

**Bertsekas, Chapter 3.2: Sufficient conditions and sensitivity analysis**

- Exercises: 3.1–3.3
- Additional topic
  - Upper semicontinuity of solutions to linear programs

**Bazaraa, Sherali, & Shetty, Chapter 5: Constraint qualifications**

- Exercises: 3, 5–6, 12–16, 20
- Topics for oral exam:
  - Relations among the CQs (strengths), and their role in the convex and linear cases

**Bazaraa, Sherali, & Shetty, Chapter 6: Lagrangian duality and saddle point optimality conditions**

- Exercises: 1, 3–7, 9, 13–14, 16, 18–19, 22, 25–26, 29–30, 34, 36–38, 41–44
- Topics for oral exam
  - Geometry of the dual problem
  - Theorems 6.2.5, 6.3.1–6.3.3, 6.3.11, 6.5.1

**Bertsekas, Chapter 5: Duality and convex programming [Section 5.4 only for orientation]**

- Exercises: 3.1, 3.3
- Topics for oral exam
  - Duality gaps in integer optimization
  - Propositions 5.1.1, 5.1.4–5.1.6, 5.3.1

**Bertsekas, Chapter 6: Dual methods [see also Bazaraa, Sherali, & Shetty, Section 8.9]**

- Exercises: 2.1; 3.1, 3.4–3.5, 3.8, 3.10, 3.12
- Topics for oral exam
  - Propositions 6.1.2, 6.3.1
- Additional topics
  - Ergodic convergence [Shor, Larsson et al.]
  - Convexification through dualization

**Bazaraa, Sherali, & Shetty, Chapter 7: The concept of an algorithm**

- Exercises: TBA
- Topics for oral exam
  - Closedness of a mapping
- Additional topics
  - Closedness versus upper semicontinuity
  - Spacer steps [Luenberger]

**Bazaraa, Sherali, & Shetty, Chapter 8: Unconstrained optimization**

- Exercises: TBA
- Topics for oral exam
  - Relationships between gradient and trust region methods
  - Theorem 8.8.3

**Bertsekas, Chapter 1: Unconstrained optimization** [*Section 1.9 only for orientation*]

- Exercises: 2.4, 2.5–2.6, 2.10
- Additional topics:
  - The Wolfe condition in line search methods [Dennis and Schnabel, 1983, 6.3]
  - Convergence of steepest descent methods [Bertsekas and Tsitsiklis, SIAM J Optim, 2000]
  - Convergence of Gauss-Seidel and Jacobi methods [Bertsekas and Tsitsiklis, 1989, 5.1, 5.5–5.6]
  - Pattern search [Lewis, Torczon, and Trosset, OPTIMA, 1998]
  - Trust region methods [Dennis and Schnabel, 1983, 6.4]
  - Non-monotone and curvilinear searches [Toint, SIAM J Sci Comput, 1996; Ferris, Lucidi, and Roma, COAP, 1996]
  - Closedness of some iterative methods [Patriksson]

**Bazaraa, Sherali, & Shetty, Chapter 9: Penalty and barrier functions**

- Exercises: TBA
- Topics for oral exam
  - Interpretations
  - Relationships

**Bertsekas, Chapter 2: Optimization over a convex set**

- Exercises: 2.2–2.3, 2.6–2.7, 3.2, 3.6, 3.8, 7.2
- Topics for oral exam
  - Relationships between optimality and the construction of improving directions

**Bazaraa, Sherali, & Shetty, Chapter 10: Methods of feasible directions** [*for orientation*]

- Exercises: TBA
- Topic for oral exam
  - Relationships between the optimality conditions and the basis for the construction of improving directions
- Additional topics
  - Simplicial decomposition [Hearn et al., Patriksson]