Convex Optimization CK Cheng Dept. of Computer Science and Engineering University of California, San Diego

### Outlines

- Staff
  - Instructor: CK Cheng
  - TAs: Po-Ya Hsu, Chester Holtz, James Lin
- Logistics
  - Websites, Textbooks, References, Grading **Policy**
- Classification
  - History and Category
- Scope
  - Coverage

# Information about the Instructor

- Instructor: CK Cheng
- Education: Ph.D. in EECS UC Berkeley
- Industrial Experiences: Engineer of AMD, Mentor Graphics, Bellcore; Consultant for technology companies
- Research: Design Automation, Brain Computer Interface
- Email: ckcheng+203B@ucsd.edu, Office: Room CSE2130
- Office hour will be posted on the course website VLSI Moore's aw
- Websites
  - http://cseweb.ucsd.edu/~kuan
  - http://cseweb.ucsd.edu/classes/wi21/cse203B

3D layout

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### Staff

**Teaching Assistant** 

- Po-Ya Hsu, p8hsu@ucsd.edu
- Chester Holtz, chholtz@ucsd.edu
- James Lin, til002@ucsd.edu

## Logistics: Class Schedule

Class Time: 2-320 PM TTH,

Discussion Session: 2-250 PM F (Separate zoom link) W - W 6

Class website: http://cseweb.ucsd.edu/classes/wi21/cse203B

Piazza link: piazza.com/ucsd/winter2021/cse203b/home

Gradescope link: https://www.gradescope.com/courses/221286

Zoom lecture:

https://ucsd.zoom.us/j/98033436384?pwd=Y3UrMDIIY0py OTRmTGovVENQSXpvdz09

For access code of the links, check with TAs or the instructor

Logistics: Grading

Exercises (Grade by completion)
Assignments (Grade by content)
oject (25%) Team 2-4

Theory 1. Homeworks (40%) · Ho - 13

2. Project (25%) Team 2-

Theory or applications of convex optimization

Survey of the state of the art approaches Convexed

Outlines, references (W4)

• Report (6PM 3/18/2021, W11)

3. Exams (35%) Open book 48 hrs

Midterm, 2/16/2021, T (W7)

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### Logistics: Textbooks

### Required text:

· Convex Optimization, Stephen Boyd and Lieven Vandenberghe, Cambridge, 2004

• Review appendix A in the first week

#### References

- Numerical Recipes: The Art of Scientific Computing, Third Edition, W.H. Press, S.A. Teukolsky, W.T. Vetterling, and B.P. Flannery, Cambridge University Press, 2007.
- Functions of Matrices: Theory and Computation, N.J. Higham, SIAM, 2008.
- Fall 2016, Convex Optimization by R. Tibshirani, http://www.stat.cmu.edu/~ryantibs/convexopt/
- EE364a: Convex Optimization I, S. Boyd, http://stanford.edu/class/ee364a/

### Classification: Brief history of convex optimization

Theory (convex analysis): 1900–1970

Algorithms

- 1947: (cimplex algorithm for linear programming (Dantzig)
- 1970s: ellipsoid method and other subgradient methods
- 1980s & 90s: polynomial-time interior-point methods for convex Optimization (Karmarkar 1984, Nesterov & Nemirovski 1994)
- since 2000s: many methods for large-scale convex optimization **Applications**
- before 1990: mostly in operations research, a few in engineering
- since 1990: many applications in engineering (control, signal processing, communications, circuit design, ...)
- since 2000s: machine learning and statistics

#### Classification Tradition Linear Nonlinear Discrete Integer **Programming** Programming **Programming** Simplex Lagrange Trial and error multiplier Primal/Dual Gradient descent Cutting plane Interior point Newton's Relaxation method iteration This class Convex Optimization Nonconvex, Discrete Problems Primal/Dual, Lagrange multiplier Local Optimal Solution Search, SA (Simulated Annealing). Gradient descent ILP (Integer Linear Programming), Newton's iteration MLP (Mixed Integer Programming), SAT (Satisfiability), SMT Interior point method

### Scope

(Satisfiability Modulo Theories), etc.

Problem Statement (Key word: convexity)

- Convex Sets (Ch2)
- Convex Functions (Ch3)  $f(x) \leq 0$
- Formulations (Ch4)

2. Tools (Key word: mechanism)

- Duality (Ch5)
- Optimal Conditions (Ch5) K.K.T.

3. Applications (Ch6,7,8) (Key words: complexity, optimality)

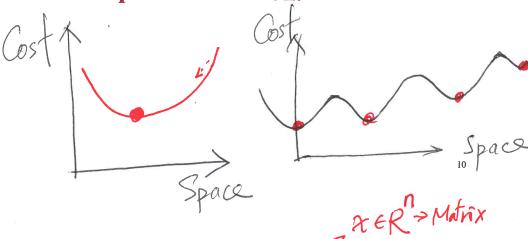
Coverage depends upon class schedule

4. Algorithms (Key words: Taylor's expansion)

- Unconstrained (Ch9)
- Equality constraints (Ch10)
- Interior method (Ch11)

# Scope of Convex Optimization

For a convex problem, a local optimal solution is also a global optimum solution.



CSE203B Convex Optimization

• Optimization of convex function with constraints which form convex domains.

### Background

- Linear algebra  $p(x) = \alpha_n x$
- Polynomial and fractional expressions
- Log and exponential functions
- Log and exponential functions
- Optimality of continuously differentiable functions

Concepts and Techniques to Master in CSE203B

- Convexity
  - Hyperplane  $\chi \in \mathbb{R}^{1}$
- Duality
- KKT optimality conditions

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