# CS091M4041H: Algorithm Design and Analysis -- Fall 2017

## **Course Information**

Staff

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Office Hours: 3:00pm-6:00pm, Wednesday

- Textbooks (recommended, not required):
  - \* T.H. Cormen, C.E. Leiserson, R. Rivest, and C. Stein, <u>Introduction to algorithms (2nd ed.)</u>, <u>MIT Press, 2001.</u> Widely available.
  - \* J. Kleinberg and E. Tardos. <u>Algorithm Design</u>, <u>Addison-Wesley</u>, 2005.
  - \* R. Motwani and P. Raghavan, <u>Randomized Algorithms. Cambridge U. Press, 1995</u>
  - \* Christos H. Papadimitriou, Kenneth Steiglitz, Kenneth Steiglitz. <u>Combinatorial Optimization:</u> <u>Algorithms And Complexity. Courier Dover Publications, 1998</u>
  - \* Ding-Zhu Du, Ker-I Ko, Xiaodong Hu. <u>Design and analysis of approximation algorithms. Springer, 2012</u>
  - \* Daming Zhu, Shaohan Ma. Algorithm design and analysis. High Education Press, 2009.

## Other reading material:

- \* Udi Manber, Introduction to Algorithms: A Creative Approach.
- \* M. Mitzenmacher and E. Upfal, Probability and Computer. Cambridge U. Press, 2005.
- \* M. R. Garey and D. S. Johnson. Computers and Intractability: A Guide to the Theory of NP-Completeness. W.H. Freeman, New York, 1979.
- Goals:
  - \* to master the ability to extract mathematically clean core of a problem,
  - \* then identify an appropriate algorithm design technique based on the problem structure observations,
  - \* and analyze algorithm performance.
- Prerequisites:

We will assume knowledge of:

- \* Basic data structures such as lists, trees, heaps, sorting and searching
- \* Basic discrete mathematics such as proofs by mathematical induction;
- \* Computability and programming experience;

#### • *Topics*:

We will cover the following topics if time permits.

- \* Problem hardness, NP-completeness;
- \* Algorithm analysis techniques, including worst-case and average-case, amortized, randomization, and competitive;
- \* Basic algorithm techniques, including greedy, iteration, divide-and-conquer, dynamic programming, network flow, linear programming;
- \* Algorithm techniques for hard problems, including approximation algorithms, local search, primal-dual algorithms, linear programming;
- \* Randomized algorithms: basic techniques from discrete probability, and applications to optimization.
- \* Specific problems from computational biology and Bioinformatics (if time permits).

## **Grading policies**

Each student is expected to do 8 assignments and attend the final examination.

## Weekly Schedule

The week number is an active link -- each week has its own page that includes required reading, recommended reading, assignment (if any), teaching assistants, etc. (Topics for weeks beyond the current and next are always tentative.)

- Week 1,2,3: Introduction to algorithm and basic design techniques
  - Lecture 1: Introduction to algorithm: some representative problems;
     Lec1.pdf;
  - Lecture 3: Divide-and-conquer technique, and the combination with randomization; Lec5.pdf; Lec5-FFT.pdf; demo merge (by K. Wayne); demo merge inversion (by K. Wayne)
  - Reading material:
    - Chapter 1 of Algorithm design,
    - Chapter 17 of Introduction to Algorithms,
    - Lecture 8, 9 of The Design and Analysis of Algorithms,
    - On the solution of linear recurrence equations (by Mohamad Akra and Louay Bazzi, 1998),
    - College Admissions and the Stability of Marriage (by Gale and Shapley, 1962),
    - STABLE ALLOCATIONS AND THE PRACTICE OF MARKET DESIGN (compiled by the Economic Sciences Prize Committee of the Royal Swedish Academy of Sciences, 2012).
    - Stable matching: Theory, evidence, and practical design (INFORMATION FOR THE PUBLIC, The Nobel prize in economic sciences, 2012),

- Who is Interested in Algorithms and Why? Lessons from the Stony Brook Algorithms Repository (by Steven S. Skiena, 1999),
- Gene coexpression measures in large heterogeneous samples using count statistics (by Y. Wang, M. S. Waterman, and H. Huang, 2014),
- Chapter 2,15,16,7,33.4 of Introduction to Algorithms,
- Chapter 5,4,6 of Algorithm design,
- Duality applied to the complexity of matrix multiplications and other bilinear forms (by J. Hopcroft, and J. Musinski, 1973),
- The Coppersmith-Winograd matrix multiplication algorithm (by M. Anderson and S. Barman, 2009),
- Some techniques for solving recurrences (by George S. Lueker, 1980)
- Karatsuba algorithm vs. grade-school method: experimental results (by Carl Burch)
- Fast Division of Large Integers --- A comparison of Algorithms (by Karl Hasselstrom, 2003)
- Quicksort (by C. A. R. Hoare, 1962)
- Ph. D. thesis of Michael Ian Shamos (Section 6.2)
- Finding and counting given length cycles (by Noga Alon, Raphael Yuster, and Uri Zwick, 1994)
- Closet Pair Data Structure: Applications (by David Eppstein)
- Dynamic Euclidean Minimum Spanning Trees and Extrema of Binary Functions (by David Eppstein, 1995)
- Fast Hierarchical Clustering and Other Applications of Dynamic Closest Pairs (by David Eppstein, 1998)
- Fourier analysis (by Cleve Moler)
- The complexity of computations (by A. A. Karatsuba, 1995),
- Sorting and selection on dymamic data (by Aris Anagnostopoulos, et al, 2011),
- Week 3, 4, 5: More on basic algorithm design techniques;
  - Lecture 4: Dynamic programming technique;
     Lec6.pdf; RNA secondary structure prediction (by Sarah Aerni); Edit distance (by Andrew McCallum); Publick-key cryptosystem (by Charles Clancy)
  - Reading material:
    - Chapter 2,15,16,7,33.4 of Introduction to Algorithms,
    - Chapter 5,4,6 of Algorithm design,
    - Gaussian eliminination is not optimal (by V. Strassen, 1968)
    - On Efficient Computation of Matrix Chain Products (by S. S. Godbole)
    - An O(n log n) algorithm for computation of matrix chain products (by T. C. Hu and M. T. Shing, 1981)
    - A general method applicable to the search for similarities in the amino acid sequence of two proteins (by Saul B. Needleman, Christian D. Wunsch, 1970)
    - Identification of Common Molecular Subsequences (by T.F.SMITH and M. S. WATERMAN, 1981)
    - The statistical distribution of nucleic acid similarities (by T.F.SMITH, M. S. WATERMAN, and C. Burks, 1985)
    - Esitmating statistical significance of sequence similarities (by M. S. WATERMAN, 1994)
    - Implementation of the Smith-Waterman Algorithm on a Reconfigurable Supercomputing Platform

- A linear space algorithm for computing maximal common subsequences (by D. S. Hirschberg, 1975)
- Basic Local Alignment Search Tool (by S. Altschul, et al. 1990)
- P-value calculation (by J. Zhang)
- PAM matrix for BLAST algorithm (by C. Alexander, 2002)
- On a routing problem (by Bellman Ford, 1958)
- Richard Bellman on the birth of dynamic programming (by Stuart Dreyfus, 2002)
- Computing Partitions with Applications to the Knapsack problem (by E. Horowitz and S. Sahni, 1974)
- The rise and fall of Knapsack cryptosystems (by A. M. Dolyzko)
- A dynamic programming approach to sequencing problems (by Michael Held and Richard M. Karp, 1962)
- Knapsack problems (by Hans Kellerer, Ulrich Pferschy, and David Pisinger, 2003)
- Week 5, 6: Still more on basic algorithm design techniques;
  - Lecture 5: Greedy technique
    - <u>Lec7.pdf</u>; <u>demo of Dijkstra's algorithm</u>; <u>demo of Interval Scheduling algorithm (by K. Wayne)</u>, <u>Lec7-Heap.pdf</u>; <u>Lec7-UnionFind.pdf</u>; <u>DemoBinaryHeap.pdf (by Kevin Wayne)</u>, <u>DemoHeapify.pdf (by Kevin Wayne)</u>,
  - Lecture 2: Basic algorithm analysis techniques, worst-case, average-case, and amortized analysis;
    - Lec2.pdf, demo of TableInsert (by C. Leiserson),
  - Reading material:
    - Chapter 2,15,16,7,33.4 of Introduction to Algorithms,
    - Chapter 5,4,6 of Algorithm design
    - a note by Sleator,
    - A note on two problems in connexion with graphs (by E. W. Dijkstra, 1959)
    - Algorithm 97: Shortest path (by Robert W. Floyd, 1962)
    - <u>Top-down analysis of path compression (by Raimund Seidel and Micha Sharir, 2005)</u>
    - Set merging algorithms (by Hopcroft J. E., Ullman J. D., 1973)
    - Efficiency of equivalence algorithms (by M. Fischer, 1972)
    - Efficiency of a good but not linear set union algorithm (by R. Tarjan, 1975)
    - Worst-case analysis of set union algoritms (by R. Tarjan, 1984)
    - A theorem on Boolean matrics (by Stephen Warshall, 1962)
    - Efficient algorithms for shortest paths in sparse networks (by Donald B. Johnson, 1977)
    - <u>Disjoint paths in networks (by J. W. Suurballe, 1974)</u>
    - An interview with Edsger W. Dijkstra (Conducted by Philip L. Frana 2001)
    - On the shortest spanning subtree of a graph and the traveling salesman problem (by Joseph B. Kruskal Jr., 1955)
    - Shortest Connection Networks and Some Generalizations (by Robert. C. Prim, 1957)
    - A Mathematical Theory of Communication (by C. E. Shannon, 1948)
    - An interview with Claude Shannon (Conducted by Robert Price, 1982)
    - An interview with Robert M. Fano (Conducted by Arthur L. Norberg, 1989)
    - A Method for the Construction of Minimum-Redundancy Codes (by DAVID A. HUFFMAN, 1952)
    - Profile: David A. Huffman Encoding the "Neatness†of Ones and Zeroes (by Gary Stix, 1991)

- Binary Essence: Various aspects of data compression
- Algorithm 245, TreeSort 3 (by Robert M. Floyd, 1964)
- Discovery of Huffman Codes (by Inna Pivkina, 2010)
- Binomial Heap Script (by Sotirios Stergiopoulos, 2001)
- Fibonacci Heap Animation (by Jason Huang Hu and Wei Wang, 2003)
- What is a matroid? (by James Oxley, 2003)
- On the abstract properties of linear dependence (by Hassler Whitney, 1935)
- Non-separable and planar graphs (by Hassler Whitney, 1932)
- Matroids and greedy algorithms(by Jack Edmonds, 1971)
- A Data Structure for Manipulating Priority Queues (by Jean Vuillemin, 1978),
- Fibonacci heaps and their uses in improved network optimization algorithms (by M. Fredman and R. Tarjan, 1987),
- Robert Tarjan --- the art of the algorihtms (by Jamie Beckett, 2004),
- Amortized Analysis Explained (by Rebecca Fiebrink)

### Week 7, 8: Linear programming

Lecture 6: Linear programming: Simplex algorithm
 Lec8.pdf, an example of cycling in simplex algorithm (given by E. M. L. Beale, 1955), an example of Klee-Minty cube, a script to generate Klee-Minty cube (with noise), a script to generate Klee-Minty cube (without noise), the DIET problem (in.math format),

#### • Reading material:

- Chapter 29 of Introduction to Algorithms, Combinatorial optimization: algorithm and complexity.
- The life and times of the father of linear programming (by Saul I. Gass),
- An interview with George B. Dantzig: the farther of linear programming (Conducted by Watts, Griffis and McOuat, 1986),
- Mathematical Methods of Organizing and Planning Production (by L. Kantorovich, 1939)
- The First Algorithm for Linear Programming: An Analysis of Kantorovich's Method (by C. van de Panne and F. Rahnama, 1985),
- CONCEPTS OF OPTIMALITY AND THEIR USES (Nobel memorial lecture, by T. Koopmans, 1975),
- Mathematics in Economics: Achievements, Difficulties, Perspectives (Nobel memorial lecture, by L. Kantorovich, 1975),
- The diet problem (by George B. Dantzig, 1990),
- A primal-dual algorithm (by George B. Dantzig, L. R. Ford, D. R. Fulkerson 1956)
- The cost of subsistence (by George Stigler, 1945),
- <u>Linear programming (by George B. Dantzig, 2002)</u>,
- Linear programming and extensions PART I (by George B. Dantzig, 1963),
- Linear programming and extensions PART II (by George B. Dantzig, 1963),
- Ellipsoid Method (by Steffen Rebennack, 2008),
- Lecture notes on the ellipsoid algorithm (by Michel Goemans, 2009),
- The Ellipsoid Method: A Survey
- Primal-Dual methods for linear programming (by Philip E. GILL, Walter MURRAY, Dulce B. PONCELEON and Michael A. SAUNDERS, 1994),
- <u>Interior point methods and linear programming (by Robert Robere, 2012)</u>,

- ON PROJECTED NEWTON BARRIER METHODS FOR LINEAR PROGRAMMING AND AN EQUIVALENCE TO KARMARKAR'S PROJECTIVE METHOD (by Philip E. Gill, Walter MURRAY, Michael A. SAUNDERS, J.A. TOMLIN, Margaret H. WRIGHT, 1986)
- A new polynomial-time algorithm for linear programming (by N. Karmarkar, 1984),
- <u>C++ implementation of Khachiya algorithm for the minimum enclosing (or covering) ellipsoid (by Bojan Nikolic)</u>,
- In memoriam: Leonid Khachiyan,
- Klee-Minty example (by H. Greenberg),
- Simplex examples,
- Smoothed complexity (by D. Spielman and S. Teng),
- Smoothed Analysis of Algorithms: Why the Simplex Algorithm Usually Takes Polynomial Time (by D. Spielman and S. Teng, 2001),
- GLPK (GNU Linear Programming Kit
- A new polynomial-time algorithm for linear programming (by N. Karmarkar, 1984),
- The interior-point revolution in optimization: history, recent developments, and lasting consequences (by Margaret H. Wright, 2004),
- Why a pure primal Newton barrier step may be infeasible? (by Margaret H. Wright, 1995)
- Numerical Optimization (by Nocedal, Jorge, Wright, S., 2006),
- Solving Inequalities and Proving Farkas's Lemma Made Easy (by David Avis and Bohdan Kaluzny),
- Week 9, 10: Linear programming (cont'd)
  - Lecture 9: Linear programming: duality;
     Lec9.pdf, A gnuplot script to illustrate Lagrangian dual, Lec9-DIET.math, Lec9-DIET-b1-2001.math, Lec9-DIET-b2-56.math, Lec9-DIET-b3-801.math
  - Reading material:
    - Chapter 29 of Introduction to Algorithms,
    - Combinatorial optimization: algorithm and complexity.
    - On the theory of games of strategy (by John von Neumann, 1928),
    - <u>Non-Cooperative Games (by John Nash, 1951)</u>,
    - Zero-sum Two-person Games (by T. E. S. Raghavan, 1994),
    - KKT Examples (by Stanley B. Gershwin),
    - <u>KKT conditions and applications (by Michel Baes)</u>,
    - <u>Duality and KKT conditions (by S. Cui)</u>,
    - The Lagrangian Relaxation Method for Solving Integer Programming Problems (by Marshall Fisher, 2004),
    - <u>Lagrange relaxation and KKT conditions ()</u>,
    - Applied integer programming --- modelling and solution
- Week 11, 12: Network flow
  - Lecture 10: Network flow and its applications;
     Lec10.pdf, Network-flow applications, demo of Ford-Fulkerson algorithm, demo of
     Edmonds-Karp algorithm, demo of Dinic algorithm, Irrational capacities might lead to endless iterations,
  - Reading material:

- Chapter 26 of Introduction to Algorithms,
- Chapter 7 of Algorithm design, Combinatorial optimization: algorithm and complexity,
- Network-flow research history (by A. Schrijver),
- Maximal flow through a network (by L. R. Ford Jr. and D. R. Fulkerson, 1956)
- Algorithm for solution of a problem of maximum flow in a network with power estimation (by E. A. Dinic, 1970),
- Dinitz' Algorithm: The Original Version and Even's Version (by Yefim Dinitz, 2006),
- Finding disjoint paths in networks (by D. Sidhu, R. Nair, and S. Abdallsh, 1991),
- Theoretical Improvements in Algorithmic Efficiency for Network Flow Problems (by Jack Edmonds and Richard M. Karp, 1972),
- Network Flow Algorithms (Andrew V.Goldberg, Eva Tardos and Robert E. Tarjan, 1990),
- <u>Maximum Matching and a Polyhedron With O,1-Vertices 1 Jack Edmonds (by Jack Edmonds, 1964)</u>,
- Paths, Trees and Flowers ,
- Paths, Trees and Flowers (by Jack Edmonds, 1965),
- Faster scaling algorithms for general graph matching problems (by H. N. Gabow, R. Tarjan, 1991),
- A Scaling Algorithm for Maximum Weight Matching in Bipartite Graphs (by Ran Duan, Hsin-Hao Su, 2012),
- Efficient Algorithms for Finding Maximal Matching in Graphs (by Zvi Galil, 1983),
- <u>Linear-Time Approximation for Maximum Weight Matching(by Ran Duan, Seth Pettie,</u> 2014),
- <u>Max-Product for Maximum Weight Matching: Convergence, Correctness, and LP Duality</u> (by Mohsen Bayati, Devavrat Shah, and Mayank Sharma, 2008),
- A Primal Method for Minimal Cost Flows with Applications to the Assignment and Transportation Problems (by Morton Klein, 1967),
- Max flows in O(nm) time, or better (by James Orlin, 2012),
- Trees: A Mathematical Tool for All Seasons, including History of algorithms to find minimum cost spanning trees (by Joe Malkevitch)
- 50 Years of Integer Programming 1958-2008: From the Early Years to the State-of-the-Art, Springer, 2010 (Edited by M. Juenger, T. M. Kiebling, D. Naddef, G. L. Nemhauser, W. R. Pulleyblank, G. Reinelt, G. Rinaldi, and L. A. Wolsey)
- Finding minimum-cost circulations by successive approximation (by Andrew V. Goldberg, Robert E. Tarjan, 1987),
- What energy functions can be minimized via graph cuts (by Vladimir Kolmogorov, Ramin Zabih, 2004),
- Polyhedral Combinatorics and Combinatorial Optimization (by Alexander Schrijver),
- Two theorems in graph theory (by Clauder Berge, 1957),
- An \$n^{5/2}\$ Algorithm for Maximum Matchings in Bipartite Graphs (by J. Hopcroft, and R. Karp, 1973),
- On representatives of subsets (by P. Hall, 1935),
- <u>A Primal Method for the Assignment and Transportation Problems (by M. L. Balinski and R. E. Gomory, 1964)</u>,
- The Hungarian Method for the Assignment Problem (by H. W. Kuhn, 1955),
- Variants of The Hungarian Method for Assignment Problems (by H. W. Kuhn, 1956)
- On the history of combinatorial optimization (by Alexander Schrijver, 2005),
- JenÂ"o EgervÂ'ary: from the origins of the Hungarian algorithm to satellite

- communication (by Silvano Martello, 2009),
- On combinatorial properties of matrices (by Jeo Egervary, 1931, Translated by H. Kuhn),
- Solutions of games by differential equations (by G. W. Brown, von Neumann, In: H. W. Kuhn and A. W. Tucker, Eds., Contributions to the Theory of Games I, Princeton University Press, Princeton, 1950)
- A certain zero-sum two-person game equivalent to the optimal assignment problem (by von Neumann, In: H. W. Kuhn and A. W. Tucker, Eds., Contributions to the Theory of Games I, Princeton University Press, Princeton, 1950),
- Algorithms for the assignment and transportation problems (by James Munkres, 1957),
- A bibliography of graph matching (by Seth Pettie),
- Differential gene expression analysis using coexpression and RNA-Seq data (by Tao Jiang et al. 2013),
- Week 13, 14: Problem intrinsic property: Hardness
  - Lecture 11: Problem hardness: Polynomial-time reduction;
     Lec3.pdf
  - Reading material:
    - Computer and intractability,
    - Chapter 8 of Algorithm design,
    - Chapter 34 of Introduction to Algorithms
    - Reducibility among combinatorial problems (by R. M. Karp, 1972), slides
    - Molecular Computation of Solutions to Combinatorial Problems (by Leonard M. Adleman, 1994),
    - Computing with DNA (by Leonard M. Adleman, 1998),
    - Computer in a testtube (by Hendrik Jan Hoogeboom, 2010),
    - How to apply de Bruijn graphs to genome assemly (by Phillip E. C. Compeau, Pavel A. Pevzner, and Glenn Tesler, 2011),
- Week 14, 15: NP-Completeness
  - Lecture 12: NP-Hard problems: packing problem, covering problems, sequencing problem, partitioning, coloring, SAT, numbering problems, etc.
     Lec4.pdf, Turing machine demo (by Zhen Ji), Turing machine demo (by Andrew Hodges, Turing machine (by K. Wayne), Computability (by K. Wayne), 2SAT is in P (by D. Moshko),
  - Reading material:
    - Computer and intractability,
    - Chapter 8 of Algorithm design,
    - Chapter 34 of Introduction to Algorithms
    - The complexity of theorem-proving procedures (by Stephen A. Cook, 1971)
    - The P versus NP problem (by Stephen Cook),
    - A compendium of NP optimization problems (Edited by Pierluigi Crescenzi, Viggo Kann, M. Halldorsson, M. Karpinski, and G. Woeinger)
- Week 16, 17: Solving hard problems: approximation and randomization
  - Lecture 11: Approximation algorithm: a brief introduction;
     Lec11.pdf, Parametric pruning algorithm for K-Center problem (by P. Potikas), Lec11-SetCover-Primal.math, Lec11-SetCover-Dual.math, Lec11-MakeSpan.math,
  - Reading material:

- Chapter 35 of Introduction to Algorithms,
- Chapter 11 of Algorithm design,
- Approximation algorithm by V. Vazirani.
- Branch and bound algorithms --- priciples and examples (by Jens Clausen, 1999)
- Parameterized complexity and approximation algorithms (by Daniel Marx, 2005)
- CS266 -- Parameterized Algorithms and Complexity (by Ryan Williams, 2013)
- Invitation to parameterized algorithms (by Rolf Niedermeier, 2002)
- Assignment 8
- Hint of Assignment 8
- Week 18: Solving hard problems: approximation and randomization
  - Lecture 12: Randomized algorithm: a brief introduction;
     Lec12.pdf, Hashing (by K. Wayne)
  - Reading material:
    - Chapter 35 of Introduction to Algorithms,
    - Chapter 13 of Algorithm design,
    - Randomized Algorithm by R. Motwani and P. Raghavan.
       Randomized algorithms (by P. Raghavan), Global Min-cuts in RNC, and other ramifications of a simple min-cut algorithm (by David R. Karger, 1992),
- Week 19: Solving hard problems: special cases and heuristics
  - Lecture 13: Extending limits of tractability;
     Lec13.pdf, TreePack: rapid side-chain prediction using tree-decomposition
  - Reading material:
    - Chapter 10 of Algorithm design,
    - lectures by D. P. Williamson.
    - Rapid side-chain prediction via tree decomposition (by Jinbo Xu, 2005),
    - Protein Threading using PROSPECT: Design and Evaluation (by Ying Xu and Dong Xu, 2000),
  - Lecture 14: Heuristics (local search strategy);
     Lec14 Local Search (by K. Wayne)
  - Reading material:
    - Chapter 11 of Algorithm design,
    - Combinatorial optimization: algorithm and complexity.





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