

# SHUCHI CHAWLA

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## RESEARCH INTERESTS

Combinatorial Optimization, Approximation Algorithms, Game Theory, Database Privacy, Machine Learning Theory and Complexity Theory.

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## EDUCATION

<b>2000-present</b>	<b>Carnegie Mellon University</b> , Pittsburgh, PA, USA. <i>Ph.D. in Computer Science</i> Advisor: Prof. Avrim Blum Dissertation: Approximation Algorithms for Path-Planning and Partitioning Problems in Graphs
<b>1996-2000</b>	<b>Indian Institute of Technology</b> , New Delhi, INDIA. <i>B.Tech. in Computer Science and Engineering</i> Advisor: Prof. Huzur Saran Senior Thesis: QoS based Scheduling in BLUETOOTH

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## ACADEMIC HONORS

<b>2004-2005</b>	Awarded <i>IBM Ph.D. Fellowship</i>
<b>2000</b>	Awarded <i>Carnegie Mellon Graduate Fellowship</i>
<b>2000</b>	Ranked 2 <sup>nd</sup> in the graduating class in IIT, Delhi.
<b>2000-1997</b>	Awarded <i>Institute Merit Award</i> in semesters 1 through 8 by IIT, Delhi.
<b>1996</b>	Ranked 32nd in All India Joint Entrance Examination (JEE-1996) for admission to the Indian Institutes of Technology.
<b>1995</b>	Gold medalist at the <i>Regional Mathematics Olympiad</i> , Delhi, India.
<b>1994</b>	Recipient of the <i>National Talent Search Examination (NTSE) Scholarship</i> awarded by National Council for Educational Research and Training (NCERT), India.

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## RESEARCH EXPERIENCE

<b>August, 2004</b>	<b>Microsoft Research, Silicon Valley Campus, CA.</b> Mentor: Cynthia Dwork Project: Database Privacy
<b>May – July, 2004</b>	<b>IBM Almaden Research Center, CA.</b> Mentor: Ravi Kumar Project: Hardness of approximation of Sparsest Cut
<b>May – Aug, 2003</b>	<b>Microsoft Research, Silicon Valley Campus, CA.</b> Mentor: Cynthia Dwork Project: Database Privacy and Rank Aggregation

May – Sept, 1999

IBM India Research Lab, New Delhi, India.

Mentors: Rajeev Shorey and Alok Aggarwal

Project: Pricing on the Internet

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REFREED PUBLICATIONS

1. **Embeddings of Negative-type Metrics and Improved Approximations to Sparsest Cut**, Shuchi Chawla, Anupam Gupta and Harald Räcke, *Symposium on Discrete Algorithms (SODA)*, 2005.
2. **Toward Privacy In Public Databases**, Shuchi Chawla, Cynthia Dwork, Frank McSherry, Adam Smith and Hoeteck Wee, *Theory of Cryptography Conference (TCC)*, 2005.
3. **Approximation Algorithms for Deadline-TSP and Vehicle Routing with Time-Windows**, Nikhil Bansal, Avrim Blum, Shuchi Chawla and Adam Meyerson, *ACM Symposium on the Theory of Computation (STOC)*, 2004.
4. **Worst-case Payoffs of a Location Game**, Shuchi Chawla, Uday Rajan, R. Ravi and Amitabh Sinha, short paper (poster) in *ACM Conference on Electronic Commerce (EC)*, 2004.
5. **Approximation Algorithms for Orienteering, Discounted Reward Collection, and Other Variants of Prize Collecting TSP**, Avrim Blum, Shuchi Chawla, David Karger, Terran Lane, Maria Minkoff and Adam Meyerson, *44th Symposium on the Foundations of Computer Science (FOCS)*, 2003.
6. **Scheduling for Flow-Time with Admission Control, or, How to Manage your "To-do" List**, Nikhil Bansal, Avrim Blum, Shuchi Chawla and Kedar Dhamdhere, *European Symposium on Algorithms (ESA)*, 2003.
7. **Profit Maximizing Mechanisms for the Extended Multicasting Game**, Shuchi Chawla, David Kitchin, Uday Rajan, Ramamoorthi Ravi and Amitabh Sinha, short paper (poster) in *ACM Conference on Electronic Commerce (EC)*, 2003.
8. **Online Oblivious Routing**, Nikhil Bansal, Avrim Blum, Shuchi Chawla and Adam Meyerson, *Symposium on Parallel Algorithms and Architecture (SPAA)*, 2003.
9. **On the Scaling of Congestion in the Internet Graph**, Aditya Akella, Shuchi Chawla, Arvind Kannan and Srinivasan Seshan, *ACM SIGCOMM Computer Communication Review*, Special Issue on the Science of Network Design (2004), 34(3):43—55.  
Preliminary version appeared in *Principles of Distributed Computing (PODC)*, 2003.
10. **Correlation Clustering**, Nikhil Bansal, Avrim Blum and Shuchi Chawla, *Machine Learning*, invited to the Special Issue on Clustering (2004), 56(1-3):89—113.  
Preliminary version appeared in *43rd Symposium on the Foundations of Computer Science (FOCS)*, 2002.
11. **Static Optimality and Dynamic Search Optimality in Lists and Trees**, Avrim Blum, Shuchi Chawla and Adam Kalai, *Algorithmica*, invited to the Special Issue on Online Algorithms (2003), 36: 249—260.

Preliminary version appeared in *Symposium on Discrete Algorithms (SODA)*, 2002.

12. **Learning from Labeled and Unlabeled Data using Graph MinCut**, Avrim Blum and Shuchi Chawla, *International Conference on Machine Learning (ICML)*, 2001.
13. **QoS based Scheduling for Incorporating Variable Rate Coded Voice in BLUETOOTH**, Shuchi Chawla, Huzur Saran and Mitali Singh, *International Conference on Communications (ICC)*, 2001.

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#### SELECTED OTHER TECHNICAL WRITINGS

14. **On the Utility of Privacy-Preserving Histograms**, Shuchi Chawla, Cynthia Dwork, Frank McSherry and Kunal Talwar, submitted to *Principles of Database Systems (PODS)*, 2005.
15. **On the Hardness of Approximating Sparsest Cut and Multicut**, Shuchi Chawla, Robert Krauthgamer, Ravi Kumar, Yuval Rabani and D. Sivakumar, submitted to *Computational Complexity (CCC)*, 2005.
16. **Bayesian Optimal No-deficit Mechanism Design**, Shuchi Chawla, Jason Hartline, Uday Rajan and R. Ravi. Technical report CMU-CS-04-153, August 2003.
17. **Approximation Algorithms for Path-planning and Clustering Problems on Graphs**, Shuchi Chawla, Thesis Proposal, Computer Science Department, Carnegie Mellon University, February 2004.
18. **Mechanisms for Internet Routing: A Study**, Aditya Akella, Shuchi Chawla and Srinivas Seshan. Technical report CMU-CS-02-163, July 2002.
19. **QoS based Scheduling in BLUETOOTH**, Shuchi Chawla, B. Tech. Thesis, IIT, Delhi, May 2000.

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#### TEACHING EXPERIENCE

<b>Fall, 2004</b>	<b>Randomized Algorithms</b> Graduate level, CMU 15-859	Lecturer: Prof. Anupam Gupta
	I helped Prof. Gupta design the course and pick the topics to be covered. I taught about half of the lectures, designed homeworks, and helped with the grading.	
<b>Spring, 2003</b>	<b>Algorithms and Applications</b> Senior level, CMU 15-499	Lecturer: Prof. Guy Blelloch
	I taught a few lectures, held office hours, designed homeworks and exams, and graded them.	
<b>Spring, 2001</b>	<b>Great Theoretical Ideas in Computer Science</b> Freshman level, CMU 15-251	Lecturer: Prof. Steven Rudich
	I taught weekly recitations, held office hours, designed homeworks and exams, and graded them.	

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## INVITED TALKS

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- **Approximation Algorithms for Path-Planning Problems**  
University of Washington, Seattle Nov, 2003  
IBM T. J. Watson Research Center Mar, 2004  
Princeton University Mar, 2004  
Cornell University Apr, 2004
- **From Idiosyncratic to Stereotypical: Toward Privacy in Public Databases**  
Microsoft Research, Redmond Nov, 2003  
DIMACS Workshop on Privacy-Preserving Data Mining Mar, 2004

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## PROFESSIONAL SERVICES

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- Member of the **CMU SCS Speakers Club**, 2002-2005.
- Member of the **CMU CS Doctoral Review Committee**, 2004-2005.
- Served as an external reviewer for Information Processing Letters, INFORMS Journal on Computing, Internet Mathematics, Journal of Computer and System Sciences, Machine Learning, Networks, Theoretical Computer Science, FOCS, STOC, SODA, Approx and ESA.

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## PERSONAL INFORMATION

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Nationality	Indian
Visa Status	F-1

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## REFERENCES

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**Prof. Avrim Blum**  
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Carnegie Mellon University  
Pittsburgh, PA 15213  
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**Prof. Anupam Gupta**  
Computer Science Department  
Carnegie Mellon University  
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**Prof. R. Ravi**  
Tepper School of Business  
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**Dr. Cynthia Dwork**  
Microsoft Research  
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**Prof. Moses Charikar**  
Dept. of Computer Science  
Princeton University  
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## Approximation Algorithms for Orienteering and Discounted-Reward TSP

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Avrim Blum, Shuchi Chawla, David Karger, Terran Lane, Maria Minkoff and Adam Meyerson

44<sup>th</sup> Symposium on the Foundations of Computer Science, 2003.

In this paper, we give the first constant-factor approximation algorithm for the rooted *Orienteering* problem. Given a graph with lengths on edges and prizes (rewards) on nodes, and a start node  $s$ , the goal in this problem is to find a path that maximizes the reward collected, subject to a hard limit on the total length of the path. We also give a constant factor approximation for a new problem motivated by robot navigation, that we call *Discounted-Reward TSP*. In this problem, instead of a length limit we are given a discount factor  $\gamma$ , and the goal is to maximize total discounted reward collected, where reward for a node reached at time  $t$  is discounted by  $\gamma^t$ . Our algorithm for *Orienteering* is the first approximation for the problem, solving a long-standing open question in Operations Research.

## Embeddings of Negative-type Metrics and An Improved Approximation to Generalized Sparsest Cut

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Shuchi Chawla, Anupam Gupta and Harald Racke

ACM SLAM Symposium on Discrete Algorithms, 2005.

In this paper, we study the metrics of *negative type*, which are metrics  $(V, d)$  such that  $\sqrt{d}$  is a Euclidean metric; these metrics are thus also known as `` $\ell_2$ -squared'' metrics. We show how to embed  $n$ -point negative-type metrics into Euclidean space  $\ell_2$  with distortion  $O(\log^{\frac{3}{4}} n)$ , improving on a classic  $O(\log n)$  distortion embedding due to Bourgain (1985). This embedding result, in turn, implies an  $O(\log^{\frac{3}{4}} k)$ -approximation algorithm for the *Sparsest Cut* problem with non-uniform demands. This result also implies that  $n$ -point subsets of the Manhattan metric embed into the Euclidean metric with distortion  $O(\log^{\frac{3}{4}} n)$ .

## On the Hardness of Approximating Multicut and Sparsest Cut

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Shuchi Chawla, Robert Krauthgamer, Ravi Kumar, Yuval Rabani and D. Sivakumar

Submitted to *Computational Complexity (CCC)*, 2005.

We consider the following *Multicut* problem – given a weighted undirected graph, with  $k$  pairs of vertices called demand pairs, find the smallest weight set of edges, the removal of which disconnects all the demand pairs. This problem is approximable within  $O(\log k)$  using a linear programming relaxation. We prove that assuming the so-called *Unique Games conjecture* of Khot (2002), it is NP-hard to approximate this problem to within an  $\Omega(\log \log k)$  factor. Our result extends to several related problems including *Sparsest Cut* and *Min-2CNF-Deletion*. Prior to our work, *Multicut* and *Min-2NF-Deletion* were known to be hard to approximate only within very small constant factors. Ours is the first hardness of approximation result for the *Sparsest Cut* problem.

## Correlation Clustering

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Nikhil Bansal, Avrim Blum and Shuchi Chawla  
*Machine Learning*, Special Issue on Clustering (2004), 56(1-3):89—113.

We introduce the following clustering problem. We are given a complete graph on  $n$  vertices (items), where each edge  $(u, v)$  is labeled either + or - depending on whether  $u$  and  $v$  have been deemed to be similar or different. The goal is to produce a partition of the vertices that agrees as much as possible with the edge labels. This formulation is motivated from a document clustering problem in which one has a pairwise similarity function  $f$  learned from past data, and the goal is to partition the current set of documents in a way that correlates with  $f$  as much as possible. An interesting feature of this formulation is that, unlike for traditional clustering measures, here one does not need to specify the number of clusters as a separate parameter. Our main results are a constant factor approximation for minimizing disagreements with edge labels and a PTAS for maximizing agreements with the labels.

## Toward Privacy In Public Databases

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Shuchi Chawla, Cynthia Dwork, Frank McSherry, Adam Smith and Hoeteck Wee  
*Theory of Cryptography Conference, 2005*.

We begin a theoretical study of the *census problem*. Informally, in a census, individual respondents give private information to a trusted party (the census bureau), who publishes a *sanitized* version of the data. There are two fundamentally conflicting requirements: *privacy* for the respondents and *utility* of the sanitized data. Unlike in secure function evaluation, here privacy is paramount; what cannot be learnt safely should not be learnt. An important contribution of this work is a definition of privacy for statistical databases, together with a method for describing and comparing the privacy offered by specific sanitization techniques. We obtain several privacy results using two different sanitization techniques, and two utility results involving clustering. Of these, the most interesting is a histogram-based summarization of data that preserves privacy with a high probability.

## Bayesian Optimal No-deficit Mechanism Design

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Shuchi Chawla, Jason Hartline, Uday Rajan and R. Ravi  
Technical report CMU-CS-04-153, August 2003.

We consider the problem of designing an auction in a Bayesian setting that gives the maximum expected profit to the auctioneer. Myerson (1981) reduces this problem to that of computing the *efficient allocation* on the bidders' *virtual valuations*, simple functions of the bidders' value distributions. We review this technique for arbitrary single parameter agent problems and further consider the problem of merging the worst case *no-deficit* condition with this average case *Bayesian expected profit maximization* – we maximize profit subject to the constraint that the auctioneer *never* makes a loss. We show that among ex post incentive compatible *no-deficit* mechanisms, the Myerson mechanism is optimal for *supermodular* costs, Myerson merged with a simple “thresholding” mechanism is optimal for *all-or-nothing* costs, and neither mechanism is optimal for general *submodular* costs. We also consider the computational hardness of the problem and Bayesian incentive compatible mechanisms.