# Sujit Prakash Gujar

# CONTACT INFORMATION

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# RESEARCH INTERESTS

Game Theory and Mechanism Design, Algorithmic Game Theory Multi-Agent Systems, Optimization, Machine Learning and Game Theory. CrowdSourcing, Cryptography, Security.

# CURRENT AFFILIATION

# January 2014-Till Date

Currently I am post-doctoral researcher in Artificial Intelligence Laboratory at École Polytechnique Fédérale de Lausanne with Prof Boi Faltings. We are working to design combinatorial auctions that preserve privacy. We are also working on various aspects of Crowd Sourcing in game theoretic settings.

## **EDUCATION**

**Ph.D.** [2006 - 2011]

Department of Computer Science and Automation (CSA),

Indian Institute of Science (IISc), Bangalore.

Advisor: Prof Y Narahari.

Title: Novel Mechanisms for Allocation of Heterogeneous Items in Strategic Settings

(Received the best thesis award. For summary, please see Appendix)

**CGPA:** 6.9/8.0.

**M.E.**, [2004 - 2006]

Department of Computer Science and Automation (CSA), IISc, Bangalore. **Thesis Title:** Measures for Classification and Detection in Steganalysis

Thesis Supervisor: Prof. C. E. Veni Madhavan.

**CGPA:** 7.2/8.0 **Rank 1** 

B.E. (ECE), [1997 - 2001], Govt. College of Engineering, Pune

GATE Score: 99.66 percentile

HSC, [1995-1997],

Maharashtra State Board of Secondary and Higher Secondary Education.

**Score:** 90.00%

# ACADEMIC HONORS

Recipient of **Alumni Medal** of IISc for the Best Doctoral Thesis in the Dept Computer Science and Automation, Indian Institute of Science, for the academic year 2012-13, March 2012.

Recipient of Infosys Fellowship.

Rank 1, ME ISE, IISc, 2004-2006 batch.

GATE Score 99.66 percentile, MHRD Scholarship holder.

Stood 5th in 'Ganit Parangat' state level (Maharashtra) examination.

Ganit Paragat is Mathematical examination conducted at school level for testing mathematical abilities.

Selected through IIT JEE (Joint Entrance Examination) for admission to IIT. (AIR2255).

#### SUMMER INTERNSHIP

Prof David C Parkes. Harvard EconCS Group, School of Engineering and Applied Sciences, *Harvard University*. (Summer 2009.)

#### **PUBLICATIONS**

#### **Journal Publications**

- 1. Sujit Gujar and Y. Narahari, "Optimal Multi-Unit Combinatorial Auctions". Operational Research, Volume 13, Issue 1, pp 27-46, April 2013. (Citations: 2)
- Akash Das Sarma, Sujit Gujar, Y Narahari, "Truthful Multi-Armed Bandit Mechanisms for Multi-Slot Sponsored Search Auctions", Current Science, Special Issue on Game Theory, Volume 103(9), pp 1064-1077, November 2012. (Citations: 6)
- 3. Sujit Gujar and Y. Narahari, "Redistribution Mechanisms for Assignment of Heterogeneous Objects". Journal of Artificial Intelligence Research, Volume 41, pp 131-154, 2011. (Citations: 15)
- 4. Dinesh Garg, Y. Narahari, Sujit Gujar, "Foundations of Mechanism Design: A Tutorial Part 1: Key Concepts and Classical Results." Sadhana Indian Academy Proceedings in Engineering Sciences, Volume 33, Part 2, pp 83-130, April 2008. (Citations: 38)
- 5. Dinesh Garg, Y. Narahari, Sujit Gujar, "Foundations of Mechanism Design: A Tutorial Part 2: Advanced Concepts and Results." Sadhana Indian Academy Proceedings in Engineering Sciences, Volume 33, Part 2, pp 131-174, April 2008. (Citations: 18)

### **Book Chapters**

6. Y. Narahari and Sujit Gujar, "Auctions in Electronic Commerce". Invited Book Chapter in: The Handbook of Technology Management, Volume III, pg 612-625, 2009. John Wiley and Sons.

### Conference Publications

Highly selective conferences

- Satyanath Bhat, Shweta Jain, Sujit Gujar and Y Narahari, An Optimal Bidimensional Multi-Armed Bandit Auction". To Appear in Iternational Conference on Autonomous Agents and Multi-Agent Systems, AAMAS 2015.
- 8. Tridib Mukherjee, Partha Dutta, Vinay Hegde and Sujit Gujar "RISC: Robust Infrastructure over Shared Computing Resources Through Dynamic Pricing and Incentivization", To appear in 29<sup>th</sup> IEEE International Parallel & Distributed Processing Symposium, IPDPS 2015.
- 9. Bhat Satyanath, Swaprava Nath, Sujit Gujar, Onno Zoeter, Y. Narahari and Chris Dance, "A mechanism to optimally balance cost and quality of labeling tasks outsourced to strategic agents." In Proceedings of the 2014 international conference on Autonomous Agents and Multi-Agent Systems (pp. 917-924), AAMAS'14. (Citations 3)
- 10. Jain Shweta, Sujit Gujar, Onno Zoeter, and Y. Narahari, "A quality assuring multi-armed bandit crowdsourcing mechanism with incentive compatible learning." In Proceedings of the 2014 international conference on Autonomous Agents and Multi-Agent Systems (pp. 1609-1610), AAMAS'14. (Citations 3)

- 11. Dutta, Partha, Tridib Mukherjee, Vinay Hegde, and Sujit Gujar. "C-Cloud: A Cost-Efficient Reliable Cloud of Surplus Computing Resources." In Cloud Computing (CLOUD), 2014 IEEE 7<sup>th</sup> International Conference on Cloud Computing, pp. 986-987. IEEE, 2014. (Citation 1)
- 12. Sujit Gujar and David Parkes, "Dynamic Matching with a Fall-back Option", In the Proceedings 19th European Conference on Artificial Intelligence (ECAI '10), pp 263-268, 2010. (Citations: 5)
- 13. James Zou, Sujit Gujar and David Parkes, "Tolerable Manipulability in Dynamic Assignment without Money". In the Proceedings 24th AAAI Conference on Artificial Intelligence (AAAI '10), 2010. (Citations: 10)
- 14. Sujit Gujar and Y Narahari, "Redistribution of VCG Payments in Assignment of Heterogeneous Objects". In Proceedings of the 4th International Workshop on Internet and Network Economics (WINE), 2008, pp 438-445. (Citations: 8)

# Other conferences / Workshop papers

- 15. Sujit Gujar and Boi Faltings, "Auction Based Mechanisms for Dynamic Task Assignments in Expert Crowdsourcing". International Workshop on Agent Mediated E-Commerce and Trading Agent Design and Analysis (AMEC/TADA) 2015, co-located with AAMAS 2015.
- Sujit Gujar and Boi Faltings, "Dynamic Task Assignments: An Online Two Sided Matching Approach". In proceedings of 3<sup>rd</sup> International Workshop on Matching Under Preferences (MATCHUP 2015). (Citation 1)
- 17. Shourya Roy, Chithralekha B and Sujit Gujar, "Sustainable Employment in India by Crowd-sourcing Enterprise Tasks. In Proceedings of the third annual Symposium on Computing for Development, ACM DEV 2013. (Citations 3)
- 18. Mukharjee, Koustuv Dasgupta, Sujit Gujar, Gueyoung Jung and Haengju Lee, "An Economic Model for Green Cloud". In the proceedings of 10th International Workshop on Middleware for Grids, Clouds and e-Science MGC 2012. (Citations: 3)
- 19. Sujit Gujar, James Zou and David Parkes, "Dynamic House Allocation", In the Proceedings of 5<sup>th</sup> Multidisciplinary Workshop on Advances in Preference Handling (M-PREF '10), pp 43-48, 2010.
- 20. Sujit Gujar and Y. Narahari, "Redistribution Mechanisms for Assignment of Heterogeneous Objects". Formal Approaches to Multi-Agent Systems, (FAMAS'09). Torino, Italy.
- 21. Sujit Gujar and Y. Narahari, "Optimal Multi-Unit Combinatorial Auctions with Single Minded Bidders". The 11th IEEE Conference on Commerce and Enterprise Computing (CEC'09), pp 74-81, 2009. (Citations: 8)
- 22. Sujit Gujar and Y Narahari, "An Optimal Multi-Unit Combinatorial Procurement Auction with Single Minded Bidders". Managing Complexity in a Distributed World, a Centenary Conference of Division of Electrical Sciences, Indian Institute of Science, (MCDES) 2008.
- 23. Sujit P Gujar and C E Veni Madhavan, "Measures for Classification and Detection in Steganalysis", In Proceedings of 3<sup>rd</sup> Workshop on Computer Vision, Graphics and Image Processing-WCVGIP, pp. 210-214, January 2006. (Citations: 3)

# **Working Papers**

- 24. Sujit Gujar and Boi Faltings, "Privacy Preserving Multi-Seller Combinatorial Auctions", A working paper.
- 25. Sujit Gujar and Boi Faltings, "Dynamic Task Assignments for Expert Crowdsourcing", A working paper.

26. Shweta Jain, Sujit Gujar, Satyanath Bhat, Onno Zoeter and Y. Narahari, "An Incentive Compatible Multi-Armed-Bandit Crowdsourcing Mechanism with Quality Assurance", Under review.

#### PATENTS FILED

- 1. Methods and Systems for Creating Tasks of Digitizing Electronic Document (US20140359418)
- 2. Methods and Systems for Crowdsourcing a Task (US20140358605)
- 3. Method and System for Providing access to CrowdSourcing Tasks (US20140304833)
- 4. Methods and Systems for Regulating Service Layer Agreements for Multiple Cloud Services (US20140200947)
- 5. Method and system for a text data entry from an electronic document (US20140072222)
- 6. Method and System for Recommending CrowdSourcability of a Business Process (US20140058784)
- 7. Feedback Based Technique Towards Total Completion of Tasks in CrowdSourcing (US20130185138)

# **REVIWER**

Reviewed Papers for ACM EC'15, AAAI'14, WINE'12, Int. Conf. on Operational Research'12, Games and Economic Behaviour (GEB), Artificial Intelligence (AI), Electronic Commerce Research and Applications (ECRA).

## TEACHING EXPERIENCE

- Currently offering CS-715: Advanced Topics in Algorithmic Game Theory and Mechanism Design at EPFL, (Spring 2015)
- Teaching assistant for CS-430: Intelligent Agents at EPFL (Fall 2014).
- Teaching assistant for CS-436: Computational Game Theory and Applications at EPFL (Fall 2014).

# STUDENTS

Co-supervised Tasorn Sornnarong. "Dynamic matching in crowdsourcing platform".

Co-supervised Mizraji Thomas. "Securing Auctions".

Currently supervising 2 master's students and one bachelor student in EPFL.

# COURSE WORK AT IISc

ME Courses (Grade)		PhD Courses (Grade)
Cryptography $(S)$	Game Theory( $\mathbf{S}$ )	Analysis-I ( <b>S</b> )
Network Storage	Design and Analysis of	Topology(A)
and Security.( $\mathbf{S}$ )	Algorithms(A)	
Data Structures(B)	$E$ -commerce( $\mathbf{S}$ )	Linear Algebra(A)
Computational Methods	Computer Communication	Topics in Approximation
of Optimization(A)	Network (A)	Algorithms(B)
Discrete Structures(A)	Pattern Recognition(B)	

(S Grade: 8/8; A Grade: 7/8; B Grade: 6/8)

# Other Courses (Audit)

Stochastic Modeling and Applications, Topology-II, Discrete Structures,

Analysis-II (Measure Theory), Topics in Graph Theory,

Algebra and Computation, Modelling and Algorithms for Large Data Sets, Calculus on Manifolds. Stochastic Approximation Algorithms, Convex Optimization (@EPFL)

#### INDUSTRY EXPERIENCE

### January 2011-Nov 2013

I worked as **Research Scientist** at Xerox Research Centre, India (XRCI). I worked on *Enterprise crowdsourcing* where we explored opportunities for enterprises to leverage advantages of crowdsourcing proposed methodologies to enable it. I also worked on *economic models for cloud computing*. Based on the work at XRCI, I have filed 7 patents and 9 patents are under preparations. I co-authored 4 papers based on my work at XRCI. I was Principal Investigator for Open Innovation project with Indian Institute of Science, Bangalore with title: "A Complex Systems Approach for Predictable Job Completion in Business Process Crowdsourcing" (Jan13 - Nov13).

## July 2001 - July 2004.

I worked as Software Engineer in PACE Soft Silicon Pvt. Ltd. During this period I acquainted various skills such as programming for multiprocessor environment, cryptography, network security and multimedia related technologies. I got exposure to work with various embedded OS/RTOS, (Real Time Operating Systems) on different platforms.

### PROFESSIONAL TRAININGS RECEIVED

"Introduction to University Teaching", École Polytechnique Fédérale de Lausanne, June 2015. (Forthcoming)

"Effective Lecturing", École Polytechnique Fédérale de Lausanne, May 2015.

"Teaching Toolkit", École Polytechnique Fédérale de Lausanne, March 2015.

"Design for Lean Six Sigma (DfLSS) Software Systems", Green Belt. Xerox Research Centre India. April 2013.

# SOFTWARE SKILLS

Programming for multiprocessor environment.

Programming Languages: C, C++, MFC, Java.

Tools: Matlab, VC++, Net-beans, Eclipse.

Operating Systems Exposure: Mac OS, Windows, Linux. RTOS: Symbian, RTLinux, WinCE.

**Date of Birth**: May 9, 1980.

#### **APPENDIX**

# Summary of Doctoral Work

# Novel Mechanisms for Allocation of Heterogeneous Items in Strategic Settings

Allocation of heterogeneous objects or resources to competing agents is a ubiquitous problem in the real world. For example, a federal government may wish to allocate different types of spectrum licenses to telecom service providers; a search engine has to assign different sponsored slots to the ads of advertisers; etc. The agents involved in such situations have private preferences over the allocations. The agents, being strategic, may manipulate the allocation procedure to get a favourable allocation. If the objects to be allocated are heterogeneous (rather than homogeneous), the problem becomes quite complex. The allocation problem becomes even more formidable in the presence of a dynamic supply and/or demand. Our thesis work is motivated by such problems involving strategic agents, heterogeneous objects, and dynamic supply and/or demand. In this thesis, we model such problems in a standard game theoretic setting and use mechanism design to propose novel solutions to the problems. We extend the current state-of-the-art in a non-trivial way by solving the following problems:

# Mechanism Design with Money

• Optimal combinatorial auctions with single minded bidders, generalizing the existing methods to take into account multiple units of heterogeneous objects.

In this work, we address designing of optimal combinatorial auctions. We extend the current art by proposing an optimal auction for procuring multiple units of multiple items when the bidders are single minded and capaciated. We develop a procurement auction that minimizes the cost of procurement while satisfying Bayesian incentive compatibility and interim individual rationality. Under appropriate regularity conditions, this optimal auction also satisfies dominant strategy incentive compatibility. The results presented here hold true for equivalent forward auction settings as well. We design an combinatorial procurement auction for the case of two item multi-unit case when single minded bidders are willing to offer volume discounts. We also, study design of optimal auction in the presence of XOR minded bidders who submit an XOR bid on two disjoint subsets of items.

• Multi-armed bandit mechanisms for sponsored search auctions with multiple slots, generalizing the current methods that only consider a single slot.

Search engines display various ads on their sites whenever there is a search. Display of these ads occur through auctions, namely sponsored search auctions. In such auctions, the advertisers pay only if their ad receives a click. Thus, the probabilities of clicks, click through rates, (CTRs) play an important role in designing sponsored search auctions. However, typically, neither search engine nor the advertisers know the CTRs before hand. The search engine can learn the CTRs by displaying the ads from various advertisers over repeated auctions. The question we address in this work is how to design a truthful multi-slot sponsored search auction which learns CTRs.

• Strategy-proof redistribution mechanisms for heterogeneous objects, expanding the scope of the current state of practice beyond homogeneous objects.

We study problem of designing redistribution mechanisms for assignment of p heterogeneous objects among n competing agents (n > p), each with unit demand. To measure a performance of a redistribution mechanism, we propose a redistribution index. Our main result states that, in general settings, no linear redistribution mechanism can have non-zero redistribution index. We propose two escape routes around this impossibility theorem. In first approach, we restrict the agents' valuations to the case of having scaling based relation, and designed an optimal redistribution mechanism with non-zero redistribution index. In second approach, we show an existence of non-linear redistribution mechanism with non-zero redistribution index if n > 2p. Moulin as well as Guo and Conitzer have designed an optimal redistribution mechanism for homogeneous object settings. We extend their linear redistribution mechanism into a non-linear redistribution mechanism, namely HETERO, that is applicable to homogeneous as well as heterogeneous settings. We conjecture that HETERO is optimal redistribution mechanism as well as redistribution index in heterogeneous settings is also same as homogeneous settings. Recently, it has been shown by Guo, that HETERO is indeed an optimal redistribution mechanism.

# On-line Mechanisms without Money

• Dynamic stable matching in two sided markets.

In their seminal work, Gale and Shapley addressed the college admission problem where colleges have preferences over students and the students have preferences over various colleges. They proposed an ingenious algorithm, deferred acceptance, for such two sided matching markets where monetary transfers are not feasible. This algorithm yields a stable matching and is strategy-proof for one side of the market. However, an inherent assumption here is that the all the agents are available. Consider the situation of campus recruitment or faculty recruitment where not all agents are simultaneously present, that is agents arrive dynamically. Any decision pertaining to a dynamic agent needs to be taken before he/she leaves the system. In the thesis, we generalize the deferred acceptance algorithm namely, GSODAS. The GSODAS is strategy-proof for static side of the market and always produces the stable matching. In general, stable matching is not possible in online settings. However, GSODAS uses the fallback option for the departing agents to achieve stability.

# • Dynamic house allocation

In the house allocation problem, each of a set of self-interested agents owns a distinct object (a house) and has strict preferences over houses. The problem is to find a reallocation of objects amongst agents that is robust against misreports of preferences by agents while identifying beneficial trades and without using money. The top-trading cycle algorithm (TTCA) by Shapley and Scarf is strategy-proof and finds an allocation in the core. An allocation in the core is stable. In the dynamic model of the house allocation problem discussed, each agent has an arrival period and a departure period and is only able to trade with other agents present simultaneously in the market at the same time. For a motivating example, consider college housing, with students on different leases and willing to trade during the month before their lease expires. Given TTCA, has very nice properties, it is natural to use TTCA as basic trading algorithm in online settings as well. We show that a naive usage of TTCA in online settings fails. We establish general conditions under which no mechanism in which an agent can influence the set of agents with which it participates in a TTCA (e.g., the period in which it trades and thus the other agents that it trades with) can be strategy-proof. Based on these conditions, we study partition mechanisms, in which each agent is assigned online to a group of agents with which it will engage in a single TTCA. We propose various partition mechanisms and experimentally shows that stochastic optimization based partition mechanism (SO-TTCA) performs quite well on rank-efficiency analysis.

### • Dynamic allocation mechanisms for allocations of heterogeneous objects

It has been shown that for allocation of goods to the agents, serial dictatorship is the only mechanism that is strategyproof. We study allocation of goods to dynamically arriving agents. We first show that, arrival-priority serial dictatorship (APSD) is the only strategyproof mechanisms for this problem and it performs poor on rank analysis. We propose a mechanism, namely Scoring Rule, (SR) which improves rank efficiency, but is manipulable. If every agent manipulates optimally, it reduces to APSD and hence we say it has tolerable manipulability.