

# VIKAS CHANDRAKANT RAYKAR

October 24, 2010

## PERSONAL DATA

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## RESEARCH INTERESTS

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Learning with imperfect supervision (learning from crowds, multiple-instance learning)  
Scalable machine learning algorithms for massive datasets  
High-dimensional classification, empirical Bayesian inference  
Machine learning applied to medical imaging (computer-aided diagnosis), survival analysis

## EDUCATION

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- MAY 2007 Doctor of Philosophy in COMPUTER SCIENCE, University of Maryland, College Park  
Thesis: [Scalable machine learning for massive datasets: Fast summation algorithms](#)  
GPA: 4.0/4.0 | Advisor: Dr. Ramani DURAISWAMI
- DEC 2003 Master of Science in ELECTRICAL ENGINEERING, University of Maryland, College Park  
Major: Signal Processing | Minor: Computer Engineering  
GPA: 3.828/4.0 | Advisors: Dr. Ramani DURAISWAMI and Dr. Rama CHELLAPPA
- MAY 2001 Bachelor of Engineering in ELECTRONICS AND COMMUNICATION ENGINEERING  
National Institute of Technology, Trichy, India  
AGGREGATE: 87.97% | Equivalent GPA: 4.0/4.0 | Department Rank: 1/51

## HONORS AND AWARDS

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- 2010 Best Scientific Paper Award in Bioinformatics and Biomedical Applications Track  
at 20th International Conference on Pattern Recognition (ICPR 2010)
- 2009 Winner of the third Data Mining Practice Prize for the best deployed data mining system  
in the industry at KDD 2009
- 2007 Received the Dean's Fellowship award for 2006-2007 for excellence in research
- 2007 Member of the Honor Society of Phi Kappa Phi 2007
- 2001 Best outgoing student in the department for the year 2000-2001
- 1999 Recipient of the National Science Fellowship Award (Engineering Stream) for the  
year 1999 funded by the Department of Science and Technology, Government of India
- 1995 Recipient of the National Talent Search Examination (NTSE) scholarship

## WORK EXPERIENCE

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- JULY 2007 | Research Scientist at SIEMENS HEALTHCARE, Malvern, PA, USA  
*Current* | *Image and Knowledge Management, CAD and Knowledge Solutions Group*  
Designed machine learning algorithms for several commercially deployed computer aided diagnosis products that automatically identify early stage cancer of the lung, colon, and breast based on X-ray, CT, and MRI images. Involved in MRMC study design and analysis for the clinical trials. Mentored several interns.

- JUN-JULY 2006 | Summer Intern at SIEMENS MEDICAL SOLUTIONS, Malvern, PA, USA  
*Computer Aided Diagnosis and Therapy Group*  
 Mentors: Dr. Harald STECK and Dr. Balaji KRISHNAPURAM  
 Worked on personalized medicine and machine learning approaches to survival analysis.
- AUG 2001-2006 | Research Assistant at UNIVERSITY OF MARYLAND, CollegePark, USA  
*Perceptual Interfaces and Realities Laboratory*  
 Mentors: Dr. Ramani DURAISWAMI and Dr. B. YEGNANARAYANA  
 Scalable machine learning algorithms. Audio signal processing. Spatial audio.
- FEB-AUG 2003 | Intern at INTEL CORPORATION, Santa Clara, CA, USA  
*Future Platforms Lab, Intel Labs*  
 Mentors: Dr. Igor KOZINTSEV and Dr. Rainer LIENHART  
 Position calibration of a network of microphones/speakers on distributed computing platforms.
- APR-MAY 2000 | Undergraduate Intern at INDIAN INSTITUTE OF SCIENCE, Bangalore, India  
 NOV-DEC 1999 | *Speech and Audio laboratory* | Mentor: Dr. T. V. SREENIVAS  
 Implemented a real-time 3D spatial audio system using Head Related Transfer Functions (HRTFs). Worked on modeling and interpolation of HRTFs.
- MAY-JUN 1999 | Summer Intern at CENTRE FOR ARTIFICIAL INTELLIGENCE AND ROBOTICS  
 Bangalore, India | Mentor: Dr. Ambalal V. PATEL  
 Implemented PI and PD controller using Fuzzy Logic.

## JOURNAL PUBLICATIONS

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7. | [Empirical Bayesian thresholding for sparse signals using mixture loss functions](#)  
 Vikas C. Raykar and Linda H. Zhao  
 To appear in Statistica Sinica.
6. | [Learning From Crowds](#)  
 Vikas C. Raykar, Shipeng Yu, Linda H. Zhao, Gerardo H. Valadez, Charles Florin, Luca Bogoni, and Linda Moy  
 Journal of Machine Learning Research, Vol. 11, pp. 1297-1322, April 2010.
5. | [Fast Computation of Kernel Estimators](#)  
 Vikas C. Raykar, Ramani Duraiswami, and Linda H. Zhao  
 Journal of Computational and Graphical Statistics, Vol. 19, No. 1, pp. 205-220, March 2010.
4. | [A fast algorithm for learning a ranking function from large scale data sets](#)  
 Vikas C. Raykar, Ramani Duraiswami, and Balaji Krishnapuram  
 IEEE Transactions on Pattern Analysis and Machine Intelligence, Vol. 30, No. 7, pp. 1158-1170, July 2008.
3. | [Extracting the frequencies of the pinna spectral notches in measured head related impulse responses](#)  
 Vikas C. Raykar, Ramani Duraiswami, and B. Yegnanarayana  
 The Journal of the Acoustical Society of America, Vol. 118, No. 1, pp. 364-374, July 2005.
2. | [Position Calibration of Microphones and Loudspeakers in Distributed Computing Platforms](#)  
 Vikas C. Raykar, Igor Kozintsev, and Rainer Lienhart  
 IEEE Transactions on Speech and Audio Processing, Vol. 13, No. 1, pp. 70-83, Jan. 2005.

1. [Speaker Localization using excitation source information in speech](#)  
Vikas C. Raykar, B.Yegnanarayana, S. R. Mahadeva Prasanna, and Ramani Duraiswami  
IEEE Transactions on Speech and Audio Processing, Vol. 13, No. 5, Part 2, pp. 751–761, Sep. 2005.

## PEER REVIEWED CONFERENCE PUBLICATIONS

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Highly selective machine learning conference papers (NIPS, AISTATS, ICML, KDD) are marked as †.

20. [Designing efficient cascaded classifiers: Tradeoff between accuracy and cost](#) †  
Vikas C. Raykar, Balaji Krishnapuram, and Shipeng Yu  
KDD'10 Proceedings of the 16th ACM SIGKDD international conference on Knowledge discovery and data mining (KDD), pp. 853–860, Washington DC, July 2010. [acceptance rate 17%] [oral presentation]
19. [A Multiple Instance Learning Approach toward Optimal Classification of Pathology Slides](#)  
Murat Dundar, Sunil Badve, Vikas C. Raykar, Rohit Jain, Olcay Sertel, and Metin Gurcan  
ICPR'10 Proceedings of 20th International Conference on Pattern Recognition, Turkey, August 2010. [acceptance rate 18%]  
[\[Best Scientific Paper Award in Bioinformatics and Biomedical Applications Track\]](#)
18. [Nonparametric prior for adaptive sparsity](#) †  
Vikas C. Raykar and Linda H. Zhao  
AISTATS'10 In Proceedings of the Thirteenth International Conference on Artificial Intelligence and Statistics (AISTATS) 2010, JMLR: W&CP 9, pp. 629–636, Italy, May 2010.
17. [Mining Medical Images](#)  
R. Bharat Rao, Glenn Fung, Balaji Krishnapuram, Jinbo Bi, Murat Dundar, Vikas C. Raykar, Shipeng Yu, Sriram Krishnan, Xiang Zhou, Arun Krishnan, Marcos Salganicoff, Luca Bogoni, Matthias Wolf, Anna Jerebko, and Jonathan Stoeckel.  
KDD'09 Proceedings of the Third Workshop on Data Mining Case Studies and Practice Prize, Fifteenth Annual SIGKDD International Conference on Knowledge Discovery and Data Mining (KDD), Paris, June 2009.  
[\[First place prize winner\]](#)
16. [Supervised Learning from Multiple Experts: Whom to trust when everyone lies a bit](#) †  
Vikas C. Raykar, Shipeng Yu, Linda Zhao, Anna Jerebko, Charles Florin, Gerardo Valadez, Luca Bogoni, and Linda Moy  
ICML'09 Proceedings of the 26th International Conference on Machine Learning (ICML), pp. 889–896, Montreal, June 2009.
15. [Bayesian Multiple Instance Learning: Automatic Feature Selection and Inductive Transfer](#) †  
Vikas C. Raykar, Balaji Krishnapuram, Jinbo Bi, Murat Dundar, and R. Bharat Rao  
ICML'08 Proceedings of the 25th International Conference on Machine Learning (ICML), pp. 808–815, Helsinki, July 2008.
14. [Polyhedral Classifier for Target Detection A Case Study: Colorectal Cancer](#) †  
Murat Dundar, Matthias Wolf, Sarang Lakare, Marcos Salganicoff, and Vikas C. Raykar  
ICML'08 Proceedings of the 25th International Conference on Machine Learning (ICML), pp. 288–295, Helsinki, July 2008.
13. [Automatic online tuning for fast Gaussian summation](#) †  
Vlad I. Morariu, Balaji V. Srinivasan, Vikas C. Raykar, Ramani Duraiswami, and Larry Davis  
NIPS'08 Advances in Neural Information Processing Systems (NIPS), vol. 21, pp. 1113–1120, 2009.
12. [Multiple instance learning improves CAD detection of masses in digital mammography](#)  
Balaji Krishnapuram, Jonathan Stoeckel, Vikas C. Raykar, R. Bharat Rao, Philippe Bamberger, Eli Ratner, Nicolas Merlet, Inna stainvas, Menahem Abramov, and Alexandra Manevitch  
IWDM'08 Proceedings of the 9th international workshop on Digital Mammography (IWDM), pp. 350–357, Tucson, AZ, July 2008. [oral presentation]

11. | [On Ranking in Survival Analysis: Bounds on the Concordance Index](#) <sup>†</sup>  
Vikas C. Raykar, Harald Steck, Balaji Krishnapuram, Cary Dehing-Oberije, Philippe Lambin  
NIPS'07 | Advances in Neural Information Processing Systems (NIPS), vol. 20, pp. 1209 -1216 , 2008.
10. | [A fast algorithm for learning large scale preference relations](#) <sup>†</sup>  
Vikas C. Raykar, Ramani Duraiswami, and Balaji Krishnapuram  
AISTATS'07 | Proceedings of the 11th International Conference on Artificial Intelligence and Statistics (AISTATS), pp. 385-392, Peurto Rico, March 2007. [oral presentation]
9. | [Efficient Kriging via Fast Matrix-Vector Products](#)  
Nargess Memarsadeghi, Vikas C. Raykar, Ramani Duraiswami, and David M. Mount  
AERO'08 | IEEE Aerospace Conference, Big Sky, Montana, March 2008.
8. | [Fast optimal bandwidth selection for kernel density estimation](#)  
Vikas C. Raykar and Ramani Duraiswami  
SDM'06 | Proceedings of the sixth SIAM International Conference on Data Mining, pp. 524-528, Bethesda, April 2006.
7. | [The manifolds of spatial hearing](#)  
Ramani Duraiswami and Vikas C. Raykar  
ICASSP'05 | Proceedings of International Conference on Acoustics, Speech and Signal Processing (ICASSP), vol. III, pp. 285-288, Philadelphia, March 2005.
6. | [Approximate expressions for the mean and the covariance of the maximum likelihood estimator for acoustic source localization](#)  
Vikas C. Raykar and Ramani Duraiswami  
ICASSP'05 | Proceedings of International Conference on Acoustics, Speech and Signal Processing (ICASSP), vol. III, pp. 73-76, Philadelphia, March 2005.
5. | [Automatic Position Calibration of Multiple Microphones](#)  
Vikas C. Raykar and Ramani Duraiswami  
ICASSP'04 | Proceedings of International Conference on Acoustics, Speech and Signal Processing (ICASSP), vol. IV, pp. 69-72, Montreal, Canada, May 2004.
4. | [Position Calibration of Audio sensors and actuators in a distributed computing platform](#)  
Vikas C. Raykar, Igor Kozintsev and Rainer Lienhart  
ACMMM'03 | ACM Multimedia 2003, pp. 572-581, Berkeley, November 2003.
3. | [Tracking a moving speaker using excitation source information](#)  
Vikas C. Raykar, Ramani Duraiswami, B.Yegnanarayana, and S. R. Mahadeva Prasanna  
ES'03 | Proceedings of the 8th Eur. Conf. Speech Communication Technology, pp. 69-72, Geneva, September 2003.
2. | [Extracting significant features from the HRTF](#)  
Vikas C. Raykar, B.Yegnanarayana, R. Duraiswami, and L. Davis  
ICAD'03 | Proceedings of the 9th International Conference on Auditory Display (ICAD 2003), pp. 115-118, Boston, July 2003.
1. | [Virtual audio system customization using visual matching of ear parameters](#)  
D. Zotkin, R. Duraiswami, L. Davis, A. Mohan, and Vikas C. Raykar,  
ICPR'02 | Proceedings of the 16th Int. Conference on Pattern Recognition, Vol. 3, pp. 1003-1006, Quebec City, August 2002.

## PEER REVIEWED ABSTRACTS / WORKSHOP PAPERS / INVITED TALKS

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14. | [Active Learning for Model Selection](#)  
Vikas C. Raykar and Subhadeep Mukhopadhyay  
Proceedings of the 5th Annual Machine Learning Symposium, New York, pp. 91-92 October 2010.

13. [CT colonography: Retrospective evaluation of the performance of computer-aided detection of colonic polyps in tagged and untagged preparation](#)  
T. Mang, L. Bogoni, M. Salganicoff, M. Wolf, V. Raykar, M. Macari, and A. Graser  
In the annual meeting of the European Congress of Radiology (ECR), March 2010.
12. [Effect of a concurrent virtual dissection with CAD for CTC interpretation: A multi-reader study evaluating accuracy and interpretation times](#)  
A.A. Ahmad, M. Macari, K.C. Cho, J.A. Bonavita, E. Robinson, L. Bogoni, M. Salganicoff, M. Wolf, and V. Raykar  
In the annual meeting of the European Congress of Radiology (ECR), March 2010.
11. [CT Kolonographie: Multizentrische Evaluation der Leistungsfähigkeit Computer-assistierter Detektion \(CAD\) kolorektaler Polypen bei Patientenvorbereitung mit und ohne Fecal Tagging](#)  
T. Mang, L. Bogoni, M. Salganicoff, M. Wolf, V. Raykar, M. Macari, P. Pickhardt, H. Ringl, and A. Graser  
Österreichisch-Bayerischer Röntgenkongress 2010
10. [Assessment of Computer-aided Nodule Detection Algorithm on Pathology Proved CT Data Sets](#)  
Sangmin Park, Tae Jung Kim, Vikas C. Raykar, Vikram Anand, Maneesh Dewan, and Anna Jerebko  
In Radiological Society of North America scientific assembly and annual meeting program (RSNA 2008), November 2008. [oral presentation]
9. [Sparse non-parametric Bayesian shrinkage for high dimensional problems](#)  
Vikas C. Raykar and Linda H. Zhao  
Invited talk at IMS-China International Conference on Statistics and Probability 2009, July 3-6, 2009, Weihai, China.
8. [Non-parametric prior for adaptive sparsity](#)  
Vikas C. Raykar and Linda H. Zhao  
Poster at the 4th Annual Machine Learning Symposium, New York, November 6 2009.
7. [Fast large scale Gaussian process regression using approximate matrix-vector products](#)  
Vikas C. Raykar and Ramani Duraiswami  
Presented at the Learning workshop 2007, San Juan, Puerto Rico, March 2007
6. [On the manifolds of spatial hearing](#)  
Vikas C. Raykar and Ramani Duraiswami  
Presented at the NIPS 2006 workshop on Novel Applications of Dimensionality Reduction.
5. [The improved fast Gauss Transform with applications to machine learning](#)  
Vikas C. Raykar and Ramani Duraiswami  
Presented at the NIPS 2005 workshop on Large scale kernel machines.
4. [Extracting the frequencies of the pinna spectral notches in measured head related impulse responses](#)  
Vikas C. Raykar, Ramani Duraiswami, and B. Yegnanarayana  
Presented at the 148th meeting of Acoustical Society of America, San Diego, California, November 2004.
3. [A study of pinna anthropometry and the spectral notch frequencies](#)  
Vikas C. Raykar, Ramani Duraiswami, and B. Yegnanarayana  
Presented at the 148th meeting of Acoustical Society of America, San Diego, California, November 2004.
2. [Self Localization of acoustic sensors and actuators on distributed platforms](#)  
Vikas C. Raykar, Igor Kozintsev and Rainer Lienhart  
ICCV 2003 International Workshop on Multimedia Technologies in E-Learning and Collaboration, Nice, France, October 2003.
1. [Head Related Impulse Response Interpolation for Dynamic Spatialization](#)  
T.V.Sreenivas, Vikas C. Raykar and Ramesh Raman  
Presented at the Texas Instruments DSPS fest-2k, November 2000, Bangalore, India.

## BOOK CHAPTERS

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4. | [Lung Nodule Detection](#)  
Luca Bogoni, Jinbo Bi, Charles Florin, Anna K. Jerebko, Arun Krishnan, Sangmin Park, Vikas C. Raykar, and Marcos Salganicoff  
In ImageCLEF: Experimental Evaluation in Visual Information Retrieval, 2010, Volume 32, Part 3, pp 415-434, Springer Berlin Heidelberg.
3. | [The Improved Fast Gauss Transform with applications to machine learning](#)  
Vikas C. Raykar and Ramani Duraiswami  
Book chapter in [Large-Scale Kernel Machines](#), L. Bottou, O. Chapelle, D. DeCoste and J. Weston (Eds.), pp. 175–201, MIT Press 2007.
2. | [Multimodal tracking for smart videoconferencing and video surveillance](#)  
Dmitry Zotkin, Vikas C. Raykar, Ramani Duraiswami and Larry S. Davis  
In Multimodal Surveillance: Sensors, Algorithms, and Systems, ed. by Z. Zhu and T. S. Huang, Artech House Publishers, Norwood, MA, 2007, pp. 141-175.
1. | [Providing Common Time and Space in Distributed AV-Sensor Networks by Self-Calibration](#)  
R. Lienhart, I. Kozintsev, D. Budnikov, I. Chikalov, and Vikas C. Raykar  
In Intelligent Multimedia Processing with Soft Computing Series: Studies in Fuzziness and Soft Computing, Vol. 168 Y. Tan, K. H. Yap, and L. Wang (Eds.) 2005.

## TECHNICAL REPORTS

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4. | [Fast weighted summation of erfc functions](#)  
Vikas C. Raykar, R. Duraiswami, and B. Krishnapuram  
CS-TR-4848, Department of computer science, University of Maryland, CollegePark.
3. | [Very fast optimal bandwidth selection for univariate kernel density estimation](#)  
Vikas C. Raykar and R. Duraiswami  
CS-TR-4774, Department of computer science, University of Maryland, CollegePark.
2. | [Fast computation of sums of Gaussians in high dimensions](#)  
Vikas C. Raykar, C. Yang, R. Duraiswami, and N. Gumerov  
CS-TR-4767, Department of computer science, University of Maryland, Collegepark.
1. | [Extracting frequencies of the pinna spectral notches in measured head related impulse responses](#)  
Vikas C. Raykar, C. Yang, R. Duraiswami, and N. Gumerov  
CS-TR-4609, Department of Computer Science. University of Maryland CollegePark (also published as UMIACS-TR-2004-51).

## PATENTS AND INTELLECTUAL PROPERTY DISCLOSURES

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9. | Systems and methods for providing a second opinion reading paradigm for computer aided diagnosis United States Patent Application 201020002  
Vikas C. Raykar
8. | Systems and methods for simultaneous parallel dump and serial waterfall model for allocating new data United States Patent Application 201020001  
Vikas C. Raykar, Matthias Wolf, and Marcos Salganicoff
7. | Systems and methods for metric learning based polyp prone/supine view matching to improve CAD performance United States Patent Application 201020675  
Meizhu Liu, Le Lu, Vikas C. Raykar, and Marcos Salganicoff

6. | Soft-gated classifier architectures for computer aided diagnosis  
United States Patent Application 200909273  
Vikas C. Raykar, Shipeng Yu, Jinbo Bi, and Marcos Salganicoff
5. | Method to establish a gold standard with contradictory information from multiple experts  
United States Patent Application 200900033  
Vikas C. Raykar, Shipeng Yu, Charles Florin, and Anna Jerebko
4. | A probabilistic framework for efficient design of cascade of linear classifiers with applications to personalized medicine and computer aided diagnosis United States Patent Application 200810572  
Vikas C. Raykar, Balaji Krishnapuram, Shipeng Yu, and R. Bharat Rao
3. | Multiple instance classification algorithms for computer aided diagnosis  
United States Patent Application 200720952  
Vikas C. Raykar, Balaji Krishnapuram, Murat Dundar, and R. Bharat Rao
2. | [Method for three-dimensional position calibration of audio sensors and actuators on a distributed computing platform](#) US Patent number 6,941,246, 2005  
Vikas C. Raykar, Rainer W. Lienhart, and Igor V. Kozintsev
1. | [Three-dimensional position calibration of audio sensors and actuators on a distributed computing platform](#) US Patent number 7,035,757, 2005  
Vikas C. Raykar, Igor V. Kozintsev, and Rainer W. Lienhart

## OPEN SOURCE SOFTWARE

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The various fast algorithms that I developed during my doctoral dissertation are released under the GNU Lesser General Public License (LGPL) and have been widely downloaded.

1. [The improved fast Gauss Transform](#)
2. [FIGTree: Fast Improved Gauss Transform with Tree Data Structure](#)
3. [Fast optimal bandwidth selection for kernel density estimation](#)
4. [Fast summation of erfc functions and ranking](#)

## COMPUTING SKILLS

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Expertise in MATLAB, R, C, and C++.

Experience with various MRMC analysis software.

## INTERNS SUPERVISED

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- 2010 SUBHADEEP MUKHOPADHYAY  
Department Statistics, Texas A&M University  
Learning loop for cloud based computer-aided diagnosis
- 2010 MEIZHU LIU (co-supervised with Le Lu)  
Department of Computer and Information Science and Engineering, University of Florida  
Colon polyp prone-supine matching using metric learning methods
- 2008 OKSANA YAKHNENKO (co-supervised with Balaji Krishnapuram)  
Computer Science Department, Iowa State University  
Predictive models for breast cancer diagnosis

## SERVICE AND PROFESSIONAL ACTIVITIES

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*Member* American Statistical Association, ACM Special Interest Group on Knowledge Discovery and Data Mining, American Association of Physicists in Medicine (AAPM) Computer Aided Detection in Diagnostic Imaging (CAD) Subcommittee.

*Journal Reviewer* Journal of Machine Learning Research, IEEE Transactions on Pattern and Machine Intelligence, Neurocomputing, Data Mining and Knowledge Discovery, IEEE Transactions on Speech and Audio Processing, IEEE Transactions on Signal Processing, Cytometry Part A.

*Conference Reviewer* AISTATS 2011, Ad-hoc reviewer for ICML, AISTATS, KDD, and NIPS conferences, ICASSP 2005.

*Program Committee* NIPS 2010 workshop on Predictive Models in Personalized Medicine.