

Rajeev Raizada

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ADDRESS University of Rochester
Dept. of Brain & Cognitive Sciences
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APPOINTMENTS **University of Rochester** July 2013 –
Assistant Professor, Dept. of Brain & Cognitive Sciences
Cornell University July 2011 – July 2013
Research Scientist, Depts. of Human Development and Psychology
Dartmouth College 2008 – 2011
Research Scientist, Neukom Institute for Computational Science

EDUCATION AND TRAINING **Univ. of Washington, Seattle** 2003 – 2008
Postdoctoral research. Advisor: Prof. Patricia Kuhl
MGH-NMR Center, Charlestown 2000 – 2003
Postdoctoral research. Advisor: Prof. Russell Poldrack
Boston University 1996 – 2000
Ph.D. in Cognitive & Neural Systems. Advisor: Prof. Stephen Grossberg
Univ. of Birmingham, England 1994 – 1995
M.Sc. in Cognitive Science
Univ. of Oxford, England 1991 – 1994
B.A. in Mathematics & Philosophy

RESEARCH INTERESTS

- How are neural representations structured, and how do they underlie behaviour?
- Neural encoding and decoding of semantics: words, sentences, and across languages
- Similarity-based representation and computation in the brain

PUBLICATIONS Google Scholar profile: <https://scholar.google.com/citations?&user=PJWjx8gAAAAJ>

Under review

- Zinszer, B., Anderson, A.J., Kang, O., Wheatley, T. and **Raizada, R.D.S.** (2015) Structural alignment of neural semantic spaces enables translation between English and Chinese words. *Under review.*
- Anderson, A. J., Binder, J., Humphries, C., Fernandino, L., Conant, L., Wang, X., Doko, D. and **Raizada, R.D.S.** (2015). A neuroscience inspired model of semantic representation predicts the word-level composition of neural activity elicited by sentence reading. *Under review.*
- Emberson, L., Zinszer, B.D., **Raizada, R.D.S.** and Aslin, R. (2015). Decoding the Infant Mind: Multichannel Pattern Analysis (MCPA) using fNIRS. *Under review.*
- Shay, E.A. and **Raizada, R.D.S.** (2015). Using neurobiologically-motivated features to investigate the semantic composition of adjectives with nouns. *Under review.*

Published

These papers can be downloaded from <http://raizadalab.org/publications.html>

- Shahbazi, R., **Raizada, R.D.S.** and Edelman, S. (2016) Similarity, kernels, and the fundamental constraints on cognition. *Journal of Mathematical Psychology, 70, 21-34.* PDF.
- Anderson, A.J., Zinszer, B. and **Raizada, R.D.S.** (2015) Representational similarity encoding for fMRI: Pattern-based synthesis to predict brain activity using stimulus-model-similarities.

NeuroImage. <http://dx.doi.org/10.1016/j.neuroimage.2015.12.035> Preprint PDF.

- **Raizada, R.D.S.** and Lee, Y.S. (2013) Smoothness without smoothing: why Gaussian Naive Bayes is not naive for multi-subject searchlight studies. *PLoS ONE*, 8(7): e69566. PDF.
- Mackey, A.P., **Raizada, R.D.S.** and Bunge, S.A. (2012) Environmental influences on prefrontal development. In: Principles of frontal lobe function (2nd Edition), edited by Donald Stuss and Robert Knight. Oxford: Oxford University Press. PDF.
- Lee, Y.S., Turkeltaub, P.E., Granger, R.H. and **Raizada, R.D.S.** (2012) Categorical speech processing in Broca's area: An fMRI study using multivariate pattern-based analysis. *Journal of Neuroscience*, 32(11), 3942-3948. PDF.
- **Raizada, R.D.S.** & Connolly, A.C. (2012) What makes different people's representations alike: neural similarity-space solves the problem of across-subject fMRI decoding. *Journal of Cognitive Neuroscience*, 24(4), 868-77. PDF. Matlab and Python analysis code. Supp.Info.
- **Raizada, R.D.S.**, Tsao, F.M., Liu, H.M., Holloway, I.D., Ansari, D. and Kuhl, P.K. (2010) Linking brain-wide multivoxel activation patterns to behaviour: examples from language and math. *NeuroImage*, 51, 462-471. PDF.
- **Raizada, R.D.S.** and Kriegeskorte, N. (2010) Pattern-information fMRI: new questions which it opens up, and challenges which face it. *International Journal of Imaging Systems and Technology*, 20(1), 31-41. Special issue on recent developments in neuroimaging, guest edited by Dae-Shik Kim. PDF.
- **Raizada, R.D.S.** and Kishiyama, M. (2010) Effects of socioeconomic status on brain development, and how Cognitive Neuroscience may contribute to leveling the playing field. *Frontiers in Human Neuroscience*. DOI: <http://dx.doi.org/10.3389/neuro.09.003.2010>. PDF.
- **Raizada, R.D.S.**, Tsao, F.M., Liu, H.M. and Kuhl, P.K. (2010) Quantifying the adequacy of neural representations for a cross-language phonetic discrimination task: prediction of individual differences. *Cerebral Cortex*, 20(1), 1-12. Advance Online Publication: April 22, 2009. PDF.
- **Raizada, R.D.S.**, Richards, T.L., Meltzoff, A. and Kuhl, P.K. (2008) Socioeconomic status predicts hemispheric specialisation of the left inferior frontal gyrus in young children. *Neuroimage*, 40(3), 1392-401. PDF.
- **Raizada, R.D.S.** and Poldrack, R.A. (2007) Challenge-driven attention: interacting frontal and brainstem systems. *Frontiers in Human Neuroscience*, 1, 3. PDF.
- **Raizada, R.D.S.** and Poldrack, R.A. (2007) Selective amplification of stimulus differences during categorical processing of speech. *Neuron*, 56(4), 726-40. PDF.
- **Raizada, R.D.S.** and Grossberg, S. (2003). Towards a theory of the laminar architecture of cerebral cortex: computational clues from the visual system. *Cerebral Cortex*, 13(1), 100-13. PDF.
- **Raizada, R.D.S.** and Grossberg, S. (2001). Context-sensitive binding by the laminar circuits of V1 and V2: A unified model of perceptual grouping, attention, and orientation contrast. *Visual Cognition*, 8 (3-5), 431-466. PDF.
- Grossberg, S. and **Raizada, R.D.S.** (2000). Contrast-sensitive perceptual grouping and object-based attention in the laminar circuits of primary visual cortex. *Vision Research*, 40, 1413-1432. PDF.

Peer-reviewed conference publications

- Zinszer, B., Anderson, A.J., Kang, O., Wheatley, T. and **Raizada, R.D.S.** (2015) You say potato, I say tudou: How speakers of different languages share the same concept. *Proceedings of the Cognitive Science Society*. PDF.
- Kleinschmidt, D.F., **Raizada, R.D.S.** and Jaeger, T.F. (2015) Supervised and unsupervised learning in phonetic adaptation. *Proceedings of the Cognitive Science Society*. PDF.
- Casey, M.A., Thompson, J., Kang, O., **Raizada, R.D.S.**, and Wheatley, T. (2011) Population codes representing musical timbre for high-level fMRI categorization of music genres. *Proceedings of the NIPS 2011 workshop on machine learning and interpretation in neuroimaging*. PDF.
- Campbell, A.T., Choudhury, T., Hu, S., Lu, H., Mukerjee, M.K., Rabbi, M. and **Raizada, R.D.S.** (2010) NeuroPhone: Brain-mobile phone interface using a wireless EEG headset. *2010*

GRANTS

Pending

- Google Faculty Award proposal: “Good representations of meaning enable good inferences: Bridging between word2vec and analogical reasoning in the human brain” (\$60K. PI: Rajeev Raizada. Expected funding-decision date: Feb. 2016)

Currently funded

- NSF Award #1228261. “Measuring and modeling object similarity in the brain: combining conceptual and perceptual representations.” (\$480K over three years. PI: Rajeev Raizada. Co-PI: Shimon Edelman)
- New York State Center of Excellence in Data Science: funding for a Ph.D. student. (2015-2016). <https://www.rochester.edu/data-science/coe/index.html>

Previously funded

- IARPA Award: “KRNS: Knowledge representation in neural systems”. Co-PI. \$400K, funding period 8/1/2013 - 2/1/2015.
- NSF Award #1058753. Co-PI with Andrew Campbell and Tanzeem Choudhury. “EAGER: Brain-Mobile Interfaces: Exploratory Research into the Development of Networked Neuro-Phones.” \$250K over two years: Sept.2010-2012.
- NSF 0121950 Cognitive Neuroscience Pilot Grant (2001-2002, \$50K indirect, co-P.I. with Russ Poldrack): “Enhancing human cortical plasticity: Visual psychophysics and fMRI”.
- General Grant Award, International Dyslexia Association (2001-2002: \$15K direct, co-P.I. with Russ Poldrack): “Magnetic resonance imaging of cross-modal processing in dyslexia”

AWARDS

McDonnell-Pew Postdoctoral Fellowship in Cognitive Neuroscience	2000 – 2003
<i>One of twenty-five awarded nationwide. \$150K over three years</i>	
Presidential University Graduate Fellowship, Boston University	1996 – 2000
<i>One of twenty-five awarded each year across all BU graduate programs</i>	
Radcliffe Prize, University of Birmingham, England	1995
<i>One of two awarded each year in the Faculty of Science</i>	

TEACHING

- BCS 513: Introduction to fMRI: Imaging, Computational Analysis & Neural Representations. Downloadable lecture slides and readings here. YouTube playlist of lectures from Spring 2013 here.
- BCS 508: Cognitive Neuroscience. Winter 2013.
- BCS 265: Language and the Brain. Spring 2015, Spring 2016. Downloadable lecture slides and readings here.
- BCS 310: Senior Seminar. Spring 2016.

MENTORING

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|--|-----------------------|
| • Primary Ph.D. advisor of BCS students Carol Jew and Elizabeth Shay | 2014 – present |
| • Secondary Ph.D. advisor of BCS student Dave Kleinschmidt | 2014 – present |
| • Postdoc advisor of Andy Anderson and Ben Zinszer | 2014 – present |
| • Co-advised a Ph.D. student: Yune-Sang Lee, Psych. Dept., Dartmouth | 2008 – 2011 |

INVITED TALKS

Cognitive Science colloquium, University at Buffalo.	April 2015
Lake Ontario Visionary Establishment conference, Niagara Falls.	Feb. 2014
Dept. of Linguistics, University of Texas at Austin	Jan. 2012
Dept. of Brain & Cognitive Sciences, University of Rochester	Jan. 2012
Dept. of Cognitive Science, UCSD	June 2011
Integrated Brain Imaging Center, University of Washington	Oct. 2010

Dept. of Human Development & Dept. of Information Science, Cornell	June 2010
Symposium speaker at Association for Psychological Science Convention: "Effects of socioeconomic status on brain development"	May 2010
Center for Cog.Neuro., Bangor University	Feb. 2010
Center for Cog.Neuro., Medical University of South Carolina	Feb. 2010
Dept. of Communication Sciences & Disorders, Northwestern University	Feb. 2010
Bernstein Centre For Comput. Neuro. / Berlin Inst. of Technology	Jan. 2010
Colloquium, Dept. of Cognitive Science, Johns Hopkins University	Oct. 2009
Neuroscience colloquium, University of Western Ontario	May 2009
Mind, Brain and Education Colloquium, Univ. of Texas at Arlington	Apr. 2009
Helen Wills Neuroscience Institute, Univ. of California, Berkeley	March 2009
CELEST Colloquium Series, Boston University	Jan. 2009
Chaired and presented symposium at Cognitive Neuroscience Society Meeting: "Pattern-based fMRI analyses as a route to revealing neural representations"	June 2008
Computational and Systems Neuroscience (CoSyNe) workshop, Snowbird	March 2008
Department of Psychology, Temple University	Jan. 2007
Department of Cognitive Science, Case Western Reserve University	Jan. 2007
Brain & Math workshop, Vanderbilt University	Nov. 2006
Institute of Cognitive Neuroscience, UCL	May 2006
MRC Cognition and Brain Sciences Unit, Cambridge, UK	May 2006
Stanford NSF-LIFE Center Workshop	2005
BrainMap Colloquium Series, MGH-NMR Center	2002
Brain, Behavior & Cognition Colloq. Series, Dept. of Psychology, Boston University	2000
Invited workshop talk: Computation in the Cortical Column,	2000
Neural Information Processing Systems Conference, Breckenridge, Colorado	

TUTORIAL
WEBPAGES

- **Interactive statistics tutorials, in Python and Matlab**
A YouTube video illustrating the interactive programs in action can be found here. These tutorials have been used for teaching at U.Mass Boston.
- **Matlab for fMRI, pattern-based analysis and SPM**
This webpage comes top in a Google search for "fMRI matlab", out of more than 200,000 results. Used for teaching at the Univ. of Arizona.
- **Matlab for neural networks**
Used for teaching at the the University of Regensburg.

MEDIA COVERAGE

- New York Times magazine article describing my Brain-Computer Interface work.
- News article in Science magazine describing my research work, and also the symposium that I chaired at the Cognitive Neuroscience Society Meeting (see p.3 of the article). Details of the symposium, "Pattern-based fMRI analyses as a route to revealing neural representations," are at http://www.dartmouth.edu/~raj/CNS_symposium.html.
- Press reports about my paper on neural amplification in Neuron, at Science Daily and Medical News Today.
- Report about my paper on SES and Broca's area in NeuroImage in the British Psychological Society Research Digest.

EXPERIENCE WITH
CHILDREN AND
PATIENT
POPULATIONS

- Performed fMRI and psychophysical testing of dyslexic and normal children, aged 5-14.
- Sept. 1995 - July 1996: Carried out voluntary work in a residential school for disabled children, Überlingen, Germany. Responsible for day-to-day care, activities and supervision of a group of three boys, ages 8 to 14. Two were autistic, one epileptic with "frontal-lobe"-esque behavioural difficulties.

PROFESSIONAL
MEMBERSHIPS

- Society for Neuroscience
- Cognitive Neuroscience Society
- Association for Psychological Science

REFEREE DUTIES

- Review Editor for the journal *Frontiers in Developmental Psychology*.
- Ad hoc reviewer for: National Science Foundation, Natural Sciences and Engineering Research Council of Canada, *Trends in Cognitive Sciences*, *NeuroImage*, *Developmental Science*, *Cerebral Cortex*, UK Medical Research Council, *Journal of Cognitive Neuroscience*, *Frontiers in Human Neuroscience*, *Neural Networks*, *Neuropsychologia*, American Educational Research Association (AERA), *IEEE Transactions on Robotics*, *IEEE Transactions on Autonomous Mental Development*, *Wiley Interdisciplinary Reviews in Cognitive Science*, *American Journal of Public Health*.

CONFERENCE PRESENTATIONS (PARTIAL LISTING)

- Zinszer, B., Anderson, A.J., Kang, O., Wheatley, T. and Raizada, R.D.S. (2015) Chinese and English speakers share representations for word-elicited concepts, but semantic models struggle to capture this similarity. *Society for the Neurobiology of Language*, Chicago.
- Shay, E.A. and Raizada, R.D.S. (2015) Using neurobiologically-motivated features to investigate the semantic composition of adjectives with nouns. *Society for the Neurobiology of Language*, Chicago.
- Wang, X. and Raizada, R.D.S. (2015) Investigating the use of earth mover's distance in cortical surface pattern-based similarity analysis. *Society for Neuroscience annual meeting*, Chicago.
- Raizada, R.D.S. (2011) A new approach to neural decoding: acting on the similarities between activation patterns, rather than on the patterns themselves. *NIPS 2011 workshop on machine learning and interpretation in neuroimaging*.
- Raizada, R.D.S., Tsao, F.M., Liu, H.M., Holloway, I.D., Ansari, D. and Kuhl, P.K. (2009) Linking whole brain activation patterns to behaviour: examples from language and math. *Society for Neuroscience*, 673.
- Lee, Y.S., Granger, R.H. and Raizada, R.D.S. (2009) Distributed and Overlapping Neural Representation of The /ba/-/da/ Phonemic Continuum: MVPA (Multi-Variate Pattern based Analysis) vs. GLM. *Human Brain Mapping*.
- Raizada, R.D.S., Tsao, F.M., Liu, H.M. and Kuhl, P.K. (2008) Individual differences in speech perception are predicted by the distinctness of underlying neural representations. *Cognitive Neuroscience Society Annual Meeting*, 15, G118.
- Raizada, R.D.S., Tsao, F.M., Liu, H.M. and Kuhl, P.K. (2007) Perceptual discriminability of stimuli is predicted by separability of evoked neural patterns. *Society for Neuroscience*, 864.1
- Raizada, R.D.S., Schwartz, D., O'Mahony, T.K., Bransford, J. and Kuhl, P.K. (2006) Trial-and-error learning and the neural reward system. *Society for Neuroscience Satellite Symposium, "From Synapse to Schoolroom: The Science of Learning"*
- Raizada, R.D.S. and Kuhl, P.K. (2006) Socioeconomic status predicts hemispheric specialisation of Broca's area. *Society for Neuroscience*, 779.1
- Raizada, R.D.S. and Poldrack, R.A. (2004) Probing the structure of phonetic categories in the human brain. *Cognitive Neuroscience Society Annual Meeting*, 11, B133.
- Raizada, R.D.S. and Poldrack, R.A. (2003). Difficult, unpredictable trials coactivate noradrenergic and frontal attentional systems. *Society for Neuroscience*, 401.4
- Raizada, R.D.S. and Poldrack, R.A. (2002). Adaptation-fMRI of categorical processing of speech. *Society for Neuroscience*, 17.7
- Raizada, R.D.S. and Poldrack, R.A. (2001) Event-related fMRI of audio-visual simultaneity perception. *Society for Neuroscience Abstracts*, 31, 511.14
- Raizada, R.D.S. and Grossberg, S. (2000) Interactions between attention, collinear grouping and orientation contrast in the laminar circuits of V1 and V2. *Society for Neurosci.*, 30, 211.12
- Raizada, R.D.S. and Grossberg, S. (1999) Laminar substrates of attention, grouping and perceptual learning in V1 and V2. *Investigative Ophth. and Visual Science (ARVO)*, 40(4), S645
- Raizada, R.D.S. and Grossberg, S. (1999) Context-sensitive processing in the laminar circuits of V1 and V2: Interacting attention, collinear grouping and orientation-contrast effects. *Society for Neuroscience*, 29, 427.13
- Raizada, R.D.S. and Grossberg, S. (1998) What are the layers of cortex for? A neural model of attention, perceptual grouping and learning in V1 and V2. *Society for Neuroscience*, 28, 105.10

REFEREES

Patricia Kuhl (Former postdoctoral advisor)
Bezos Family Foundation Endowed Chair in Early Childhood Learning
Co-Director, Institute for Learning and Brain Sciences
University of Washington
Box 357988, Seattle WA 98195
E.mail: pkkuhl@u.washington.edu

Russell Poldrack (Former postdoctoral advisor)
Director of the Imaging Research Center
The University of Texas at Austin
Department of Psychology
1 University Station A8000, Austin, Texas 78712-0187
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Stephen Grossberg (Doctoral advisor)
Wang Professor of Cognitive and Neural Systems
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