# Saurabh Vyas

Professional Experience Columbia University, New York, NY Postdoctoral Research Fellow Mortimer B. Zuckerman Mind Brain Behavior Institute Advisor: Mark M. Churchland	- present 1 - 2014
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Applied Physics Laboratory, Laurel, MD Systems Engineer Intelligent Systems & Robotics Group	
Education  Stanford University, Stanford, CA Ph.D. in Bioengineering Thesis: "Neural population dynamics underlying motor learning" Advisor: Krishna V. Shenoy Donald B. Lindsley Prize (outstanding thesis award by Society for Neuroscience)	.4 - 2020
Johns Hopkins University, Baltimore, MD M.S.E. in Biomedical Engineering B.S. in Biomedical Engineering B.S. in Electrical Engineering University Honors	08 - 2014
Awards, Honors, & Donald B. Lindsley Prize in Behavioral Neuroscience, Society for Neuroscience Fellowships Sammy Kuo Award in Neuroscience (Finalist), Stanford University NIH F31, Ruth L. Kirschstein National Research Service Award Best Talk (1st Place), Stanford Bioengineering Retreat National Science Foundation IGERT trainee in Mind, Brain, and Computation Biosciences Travel Grant, Stanford University National Science Foundation Graduate Research Fellowship Ric Weiland Graduate Fellowship, Stanford University Graduated with University Honors, Johns Hopkins University Team Process Award, Design Day, Johns Hopkins University People's Choice Award, Medical Device Competition, Rice University Invention of the Year (Finalist), Johns Hopkins Office of Technology Transfer Project Award, Computer Integrated Surgery, Johns Hopkins University Robert C. Byrd Scholarship, State of Maryland Dorr Family Foundation Scholar, Scholarship for Academic Excellence Merit Scholastic Award, State of Maryland Distinguished Scholars, State of Maryland Advanced Placement Scholar with Distinction, CollegeBoard Science, Engineering, Apprentice Program Fellow, United States Naval Academy Science, Engineering, Apprentice Program Fellow, United States Naval Academy	2022 2021 2018 2017 2017 2015 2015 2014 2012 2012 2012 2011 2011 2008 2008 2008
Publications  Preprints  Verhein JR*, Vyas S*, Shenoy KV, "Methylphenidate modulates motor cortical dynambehavior." bioRxiv, 2023. (*equal contribution)	mics and

Trautmann EM, Hesse JK, Stine G, Xia R, Shude Zhu S, O'Shea DJ, Karsh B, Colonell J, Lanfranchi F, **Vyas S**, Zimnik A, Steinmann NA, Wagenaar DA, Andrei A, Lopez CM, O'Callaghan J, Putzeys J, Raducanu BC, Welkenhuysen M, Churchland MM, Moore T\*, Shadlen M\*, Shenoy KV\*, Tsao D\*, Dutta B†, Harris T†, "Large-scale brain-wide neural recording in nonhuman primates." *bioRxiv*, 2022. (\*,†equal contribution)

O'Shea DJ\*, Duncker L\*, Goo W, Sun X,  $\underline{\mathbf{Vyas}}$  S, Trautmann EM, Diester I, Ramakrishnan C, Deisseroth K, Sahani M<sup>†</sup>, Shenoy KV<sup>†</sup>. "Direct neural perturbations reveal a dynamical mechanism for robust computation." bioRxiv, 2022. (\*,<sup>†</sup>equal contribution)

Gorini C, Iyer SM, <u>Vyas S</u>, Ramakrishnan C, Deisseroth K, Delp SL, "Reversible temporally-specific inhibition of muscle using a light-activated chloride channel," *bioRxiv*, 2018.

Journal Articles Sun X\*, O'Shea DJ\*, Golub MD, Trautmann EM, **Vyas S**, Ryu SI, Shenoy KV, "Cortical preparatory activity indexes learned motor memories," *Nature*, 2021. (\*equal contribution)

Al Borno M, **Vyas S**, Shenoy KV, Delp SL, "High-fidelity Musculoskeletal Modeling Reveals that Motor Planning Variability Contributes to the Speed-Accuracy Tradeoff," *eLife*, 2021.

**Vyas S**, O'Shea DJ, Ryu SI, Shenoy KV, "Causal role of motor preparation during error-driven learning," *Neuron*, 2020.

**Vyas S**, Golub MD, Sussillo D, Shenoy KV, "Computation through neural population dynamics," *Annual Review of Neuroscience*, 2020.

Trautmann EM, Stavisky SD, Lahiri S, Ames KC, Kaufman MT, O'Shea DJ, <u>Vyas S</u>, Sun X, Ryu SI, Ganguli S, Shenoy KV, "Accurate estimation of neural population dynamics without spike sorting," *Neuron*, 2019.

Even-Chen N\*, Sheffer B\*, **Vyas S**, Ryu SI, Shenoy KV, "Structure and variability of delay activity in premotor cortex," *PLoS Computational Biology*, 2019. (\*equal contribution)

<u>Vyas S</u>, Even-Chen N, Stavisky SD, Ryu SI, Nuyujukian P, Shenoy KV, "Neural population dynamics underlying motor learning transfer," *Neuron*, 2018.

Williams A, Kim TH, Wang F, <u>Vyas S</u>, Ryu SI, Shenoy KV, Schnitzer ML, Kolda TG, Ganguli S, "Unsupervised discovery of demixed, low-dimensional neural dynamics across multiple timescales through tensor components analysis," *Neuron*, 2018.

Vyas S, Huang H, Gale J, Sarma S<sup>†</sup>, Montgomery E<sup>†</sup>, "Complexity of Dynamics in STN Neuronal Systems is reduced in Parkinson's Disease compared to Epilepsy," *IEEE Transactions on Neural Systems and Rehabilitation Engineering*, 2016. (†equal contribution)

Christensen AJ\*, Iyer SM\*, Francois A, <u>Vyas S</u>, Ramakrishnan C, Vesuna S, Deisseroth K, Scherrer G, Delp SL. "In Vivo Interrogation of Spinal Mechanosensory Circuits," *Cell Reports*, 2016. (\*equal contribution)

Mendrik A, Vincken K, Kuijf H, Breeuwer M, Bouvy W, Bresser J, Alansary A, Bruijne M, Carass A, El-Baz A, Jog A, Katyal R, Khan A, Lijn F, Mahmood Q, Mukherjee R, Opbroek A, Paneri S, Pereira S, Persson M, Rajchl M, Sarikaya D, Smedby O, Silva C, Vrooman H, **Vyas S**, Wang C, Zhao L, Biessels G, and Viergever M, "MRBrainS Challenge: Online Evaluation Framework for Brain Image Segmentation in 3T MRI Scans," *Computational Intelligence and Neuroscience*, 2015.

<u>Vyas S</u>, Meyerle J, Burlina P, "Non-Invasive Estimation of Skin Thickness from Hyperspectral Imaging and Validation using Echography," *Computers in Biology and Medicine*, 2015.

Mukherjee R, **Vyas S**, Juang R, Sprouse C, Burlina P, "Endocardial Surface Delineation in 3D Transesophageal Echocardiography," *Ultrasound in Medicine and Biology*, 2013.

**Vyas S**, Banerjee A, Burlina P, "Estimating Skin Parameters from Hyperspectral Signatures," *Journal of Biomedical Optics*, 2013.

## Peer-reviewed Conference Submissions

O'Shea DJ, Duncker L, <u>Vyas S</u>, Sun X, Sahani, M, Shenoy KV, "Electrical but not optogenetic stimulation drives nonlinear contraction of neural states," Computational and Systems Neuroscience abstract (COSYNE), Lisbon, Portugal, 2022.

O'Shea DJ\*, Trautmann EM\*, Sun X, **Vyas S**, Shenoy KV, "Motor cortical neural dynamics are finely spatially intermingled," Computational and Systems Neuroscience abstract (COSYNE), Online, 2021.

<u>Vyas S</u>, O'Shea DJ, Shenoy KV, "Causal role of motor preparation during error-driven learning," Advances in Motor Learning and Motor Control (MLMC), Chicago, I.L., 2019. *Talk*.

Willett FR, <u>Vyas S</u>, Michaels JA, Henderson JM, Shenoy KV, "Neural network models for closed-loop musculoskeletal arm control," Computational and Systems Neuroscience abstract (COSYNE), Lisbon, Portugal, 2019.

Lahiri S, Trautmann EM, Stavisky SD, Ames KC, Kaufman MT, O'Shea DJ, <u>Vyas S</u>, Sun X, Ryu SI, Ganguli S, Shenoy KV, "Accurate estimation of neural population dynamics without spike sorting." Computational and Systems Neuroscience abstract (COSYNE), Lisbon, Portugal, 2019.

**Vyas S**, Even-Chen N, Stavisky SD, Ryu SI, Nuyujukian P, Shenoy KV, "Neural population dynamics underlying motor learning transfer," Computational and Systems Neuroscience abstract (COSYNE), Denver, CO, 2018.

<u>Vyas S</u>, Even-Chen N, Stavisky SD, Ryu SI, Nuyujukian P, Shenoy KV, "Neural population dynamics underlying covert-to-overt motor learning transfer," Advances in Motor Learning and Motor Control (MLMC), Washington D.C., 2017. *Talk*.

Williams A, Kim TH, Wang F, <u>Vyas S</u>, Ryu SI, Shenoy KV, Schnitzer ML, Kolda TG, Ganguli S, "Dimension reduction of multi-trial neural data by tensor decomposition," Computational and Systems Neuroscience abstract (COSYNE), Salt Lake City, UT, 2017. *Talk*.

<u>Vyas S</u>, Christensen AJ, Mitelut C, Iyer SM, Gratiy S, Delp SL, Anastassiou C, "A point process approach to inferring connectivity from biophysical simulations of Ca2+ fluorescence," Computational and Systems Neuroscience abstract (COSYNE), Salt Lake City, UT, 2016.

Vyas S, Gammie J, Burlina P, "Computing Cardiac Strain from Variational Optical Flow in Four-Dimensional Echocardiography," IEEE CBMS: Computer-based Medical Systems, 2014. Talk. Finalist - Best Student Paper Award

<u>Vyas S</u>, Meyerle J, Burlina P, "Cross Validating Hyperspectral with Ultrasound-based Skin Thickness Estimation," IEEE Hyperspectral Image and Signal Processing: Evolution in Remote Sensing (IEEE WHISPERS), 2014.

Vyas S\*, Burlina P, Kleissas D, Mukherjee R\*, "Automated Walks using Machine Learning for

Segmentation," International Conference on Medical Image Computing and Computer Assisted Intervention (MICCAI), Grand Challenge on MR Brain Segmentation (MRBrains13), 2013. Talk. (\*equal contribution)

**Vyas S**, Banerjee A, Burlina P, "Machine Learning Methods for In Vivo Skin Parameter Estimation," IEEE CBMS: Computer-based Medical Systems, 2013.

**Vyas S**, Mukherjee R, Sosa F, Burlina P, "Endocardium Segmentation in 3D Transesophageal Echocardiography," IEEE ISBI: International Symposium on Biomedical Imaging: From Nano to Macro, 2013.

**Vyas S**, Banerjee A, Garza L, Kang S, Burlina P, "Hyperspectral Signature Analysis of Skin Parameters," SPIE-MI: Proceedings of SPIE Medical Imaging, 2013. *Talk*.

Peterson E, Mukherjee R, <u>Vyas S</u>, Cornish D, "Galaxy: Link Space Visualization and Analysis of Network Traffic," IEEE Visual Analytics in Science & Technology (VAST-MC3), 2013. **Honorable Mention** – "Intriguing Visualization"

Vyas S\*, Su S\*, Kim R\*, Kuo N, Taylor RH, Kang J, Boctor EM, "Intraoperative Ultrasound to Stereocamera Registration using Interventional Photoacoustic Imaging," SPIE-MI: Proceedings of SPIE Medical Imaging, 2012. (\*equal contribution)

### Conference Abstracts

<u>Vyas S</u>, Trautmann EM, Fakhoury T, Liwtin-Kumar A, Shadlen MS, Churchland MM, "Hierarchical division of labor during cognitive-motor sequences," Neural Control of Movement, Dubrovnik, Croatia, 2024.

O'Shea DJ, Trautmann EM, Sun X, <u>Vyas S</u>, Shenoy KV, "Spatial microstructure of motor cortical neural dynamics," Neural Control of Movement, Dubrovnik, Croatia, 2024.

O'Shea DJ, Trautmann EM, Sun X, <u>Vyas S</u>, Shenoy KV, "Spatial microstructure of motor cortical neural dynamics," Society for Neuroscience, Washington D.C., 2023.

O'Shea DJ, Duncker L, Sun X, <u>Vyas S</u>, Deisseroth, K, Sahani, M, Shenoy KV, "Optogenetic and electrical perturbations in motor cortex reveal a neural population mechanism for robust computation," Society for Neuroscience, San Diego, C.A., 2022.

Willett F, <u>Vyas S</u>, Michaels JA, Henderson JM, Shenoy KV, "Feedback control dynamics explain motor cortical activity," Society for Neuroscience, Virtual, 2021.

O'Shea DJ, Trautmann EM, Sun X, <u>Vyas S</u>, Shenoy KV, "High-density silicon probes reveal signatures of neural circuit organization in motor cortical dynamics." Neural Control of Movement, Online, 2021.

<u>Vyas S</u>, O'Shea DJ, Ryu SI, Shenoy KV, "Causal role of motor preparation during error-driven learning," Society for Neuroscience, Chicago, I.L., 2019.

Verhein JR\*, <u>Vyas S</u>\*, Shenoy KV, "Towards a neural population-level understanding of the effects of methylphenidate (Ritalin) in motor cortex of reaching monkeys," Society for Neuroscience, Chicago, I.L., 2019. (\*equal contribution)

Trautmann EM, O'Shea DJ, Sun X, <u>Vyas S</u>, Ryu SI, Shenoy KV, "Spatially heterogenous tuning in rhesus motor cortex revealed using neuropixels probes," Society for Neuroscience, Chicago, I.L., 2019.

Deo DR, Willett FR, Avansino DT, <u>Vyas S</u>, Even-Chen N, Hochberg LR, Henderson JM, Shenoy KV, "Neural representation of attempted movement of a paralyzed limb in a person, and implications for intracortical brain-computer interfaces," Society for Neuroscience, Chicago, I.L., 2019.

Sun X, O'Shea DJ, Trautmann EM, Golub MD, <u>Vyas S</u>, Fisher TG, Ryu SI, Shenoy KV, "Changes in neural population activity underlying the learning of novel arm dynamics," Society for Neuroscience, Chicago, I.L., 2019.

Verhein JR\*, **Vyas S**\*, Shenoy KV, "Towards a neural population-level understanding of the effects of methylphenidate (Ritalin) in motor cortex of reaching monkeys," Neural Control of Movement, Toyama, Japan, 2019. (\*equal contribution)

Sun X, O'Shea DJ, Trautmann EM, Golub MD, <u>Vyas S</u>, Fisher TG, Ryu SI, Shenoy KV, "Exploration of distinct neural activity repertoire during learning of new arm dynamics," Neural Control of Movement, Toyama, Japan, 2019.

Vyas S, O'Shea DJ, Trautmann EM, Willett FR, Shenoy KV, "Motor cortical preparatory activity is causally involved in visuomotor learning," Society for Neuroscience, San Diego, C.A., 2018

Trautmann EM, O'Shea DJ, <u>Vyas S</u>, Shenoy KV, "Recording large populations of neurons with single-cell resolution in nonhuman primates using Neuropixels," Cell-NERF Symposium: Neurotechnologies, Leuven, Belgium, 2018.

Even-Chen N, Sheffer B, <u>Vyas S</u>, Ryu SI, Shenoy KV, "Spatial encoding of reaches in preparatory motor cortical activity," Neural Control of Movement, Santa Fe, N.M., 2018.

**Vyas S**, Even-Chen N, Stavisky SD, Ryu SI, Nuyujukian P, Shenoy KV, "Brain-machine interface guided movements share a common neural substrate with overt movements," Society for Neuroscience, Nanosymposium on Motor Control and Internal Representations, Washington D.C., 2017. *Talk.* **Selected as SfN Hot Topic**.

Even-Chen N, <u>Vyas S</u>, Ryu SI, Shenoy KV, "The effect of task dimensionality on BMI performance," Society for Neuroscience, Washington D.C., 2017.

Sheffer B, Even-Chen N, <u>Vyas S</u>, Ryu SI, Shenoy KV, "Direction and distance decoding accuracy from plan activity in monkey motor cortex," Society for Neuroscience, Washington D.C., 2017.

Williams A, Poole B, Maheswaranathan N, Kim TH, Wang F, <u>Vyas S</u>, Shenoy KV, Schnitzer ML, Kolda TG, Ganguli S, "Low-dimensional representations of learning in multi-trial datasets," Society for Neuroscience, Washington D.C., 2017.

**Vyas S**, Christensen AJ, Iyer SM, Ramakrishnan C, Deisseroth K, Delp SL, "Optical and computational tools for analyzing somatosensory circuits," Society for Neuroscience, Chicago, IL, 2015.

Christensen AJ, Iyer SM, <u>Vyas S</u>, Francois A, Scherrer G, Deisseroth K, Delp SL, "Optogenetic tools for perturbing spinal neural circuits," Society for Neuroscience, Chicago, IL, 2015.

Iyer SM, Christensen AJ, <u>Vyas S</u>, Vesuna S, Francois A, Ramakrishnan C, Deisseroth K, Scherrer G, Delp SL, "Optogenetic interrogation of mammalian mechanosensory and nociceptive circuits," Society for Neuroscience, Chicago, IL, 2015.

**Vyas S**, Nguyen HV, Burlina P, Banerjee A, Garza L, Chellappa R, "Computational Modeling of Skin Reflectance Spectra for Biological Parameter Estimation through Machine Learning," SPIE: Proceedings of SPIE, 2012. *Talk*.

Patents

Burlina P, Banerjee A, <u>Vyas S</u>, Garza L, "Hyperspectral Imaging for Detection of Skin Related Conditions," U.S. Patent No. 8,761,476. Granted on June 24, 2014.

Talks

Janelia Research Campus, Mechanistic Cognitive Neuroscience Junior Scientist Workshop, "Neural computations underlying complex cognitive motor sequences," 2022.

Simons-Emory International Consortium on Motor Control, Workshop on Neural Dynamics, "Computation through dynamics," 2020.

Princeton University, Prof. Tim Buschman's group, "What role does motor preparation play during motor learning," 2020.

Columbia University, Prof. Daniel Salzman's group, "What role does motor preparation play during motor learning," 2020.

Columbia University, Prof. Mark Churchland's group, "What role does motor preparation play during motor learning," 2020.

Stanford University, Department of Neurobiology, "The Shenoy Lab Evening," Stanford, CA, "Neural population dynamics underlying motor learning," 2019.

Advances in Motor Learning and Motor Control (MLMC), Chicago, IL, "Causal role of motor preparation during error-driven learning," 2019.

Massachusetts Institute of Technology, Prof. Mehrdad Jazayeri's group, Cambridge, MA, "Neural population dynamics underlying visuomotor learning," 2019.

University of Chicago, Prof. David Freedman's group, Chicago, IL, "Neural population dynamics underlying visuomotor learning," 2019.

Carnegie Mellon University, Profs. Byron Yu's & Matt Smith's groups, Pittsburgh, PA, "Neural population dynamics underlying visuomotor learning," 2019.

University of California, Berkeley, Prof. Jose Carmena's group, Berkeley, CA, "Neural population dynamics underlying visuomotor learning," 2019.

Stanford University, Invited talk at Center for Mind, Brain, Computation, and Technology (MBCT), Stanford, CA, "Neural population dynamics underlying visuomotor learning," 2019.

Johns Hopkins University, Prof. Reza Shadmehr's group, Baltimore, MD, "Neural population dynamics underlying visuomotor learning," 2018.

Advances in Motor Learning and Motor Control (MLMC), Washington DC, "Neural population dynamics underlying covert-to-overt motor learning transfer," 2017.

Society for Neuroscience, Nanosymposium on Motor Control and Internal Representations, Washington DC, "Brain-machine interface guided movements share a common neural substrate with overt movements," 2017.

Stanford University, Bioengineering Retreat, Chaminade Resort & Spa, Santa Cruz, CA, "Neural population dynamics underlying motor learning transfer," 2017. 1st Place - Best Talk

Stanford University, Invited talk to Neurosciences Ph.D. program candidates, hosted by Prof. Jay McClelland. "Neural Dynamics and Adaptation for Brain-Machine Interface Control." 2017

Stanford University, Bioengineering Retreat, Chaminade Resort & Spa, Santa Cruz, CA, "Towards a freely moving macaque model for motor neuroscience and brain-machine interfaces," 2016

Google, Invited talk by Dr. Thomas Dean, Mountain View, CA, "Estimating Neuronal Connectivity from Calcium Imaging Data," 2015

IEEE CBMS conference in New York, NY, "Computing Cardiac Strain from Variational Optical Flow in Four-Dimensional Echocardiography," 2014.

MICCAI workshop in Nagoya, Japan. "Automated Walks using Machine Learning for Segmentation," 2013.

ISBI conference in San Francisco, CA, "Endocardium Segmentation in 3D Transesophageal Echocardiography," 2013.

SPIE Medical Imaging conference in Orlando, FL, "Hyperspectral Signature Analysis of Skin Parameters," 2013.

SPIE conference in Baltimore, MD, "Computational Modeling of Skin Reflectance Spectra for Biological Parameter Estimation through Machine Learning," 2012.

SPIE Medical Imaging conference in San Diego, CA, "Intraoperative Ultrasound to Stereocamera Registration using Interventional Photoacoustic Imaging," 2012.

#### Teaching

EE 124: Introduction to NeuroElectrical Engineering, Stanford University

Co-instructor with Prof. Krishna Shenoy

Winter 2018

NBio 227: Techniques in Neuroscience, Stanford University

Autumn 2017, 2018

Guest lecturer on Brain Machine Interfaces

BIOS 230: Biomedical Data Analysis in Matlab, Stanford University

Co-developed and co-instructed 3-week mini course (with Nimit Jain)

#### Course Assistant

EE 364a: Convex Optimization, Stanford University	Spring 2017; Winter 2018, 2019
EE 278: Statistical Signal Processing, Stanford University	Autumn 2018
EE 376a: Information Theory, Stanford University	Winter 2017
BioE 281: Biomechanics of Movement, Stanford University	Winter 2016
CS 229: Machine Learning, Stanford University	Autumn 2015
580.421: Systems Bioengineering Laboratory, Johns Hopkins U	University Fall 2012

# Outreach & Service

Zuckerman Institute Gender Inclusion Group, Columbia University Board member; Supporting and advocating for people who have been historically marginalized in STEM fields due to their gender identity and expression.

Zuckerman Institute Postdoctoral Seminar eXtramural, Columbia University 2023 – present Co-organized extramural postdoctoral seminar series, focusing on scientists historically marginalized in science.

Zuckerman Institute Athletics Club, Columbia University

2021 – present

Board member; co-organized running and triathlon activities.

Computational Neuroscience Journal Club, Stanford University

2015 – 2018

Co-founder and co-organizer.

Stanford Biosciences Student Association, Stanford University

Mentored first-year biosciences (bioengineering) graduate students.

Center for Mind, Brain, & Computation, Stanford University

Organized the Monday evening seminar series; invited and hosted speakers.

2015 – 2019

Stanford Undergraduate Research Association, Stanford University

Mentored undergraduate students interested in research opportunities.

2024 - present

Biomedical Engineering Society, Stanford University  Mentored undergraduate students interested in bioengineering careers.	2015
Boys and Girls Club, Palo Alto, CA SAT tutoring for high school students in the east Palo Alto area.	2015 - 2016
ASPIRE Program, Johns Hopkins Applied Physics Laboratory Mentored high school students in robotics, and computer vision.	2013 - 2014
College Prep Program, Johns Hopkins University  Developed an SAT curriculum; lectured a classroom of 20 students.	2013 - 2014
Tutorial Project, Johns Hopkins University Tutored math and reading to Baltimore City Elementary school students.	2012
$\label{eq:Adhoc} Ad\ hoc\ \text{reviewer:}$ Nature Neuroscience, Nature Communications, Nature Human Behavior, Communications Biology, Cell Reports, Journal of Neural Engineering, Neural	Networks