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## Expertise

Deep learning | Reinforcement learning | Statistical machine learning | Natural Language Processing | Computational neuroscience | Cognitive neuroscience | Animal behavior | Motor learning | Electrophysiological neural recording | Eye tracking | Hand tracking | MRI | fMRI | EEG | EMG | Data Visualization

## **Technical Skills**

Python: Tensorflow, Jupyter notebook, Google Colaboratory, Google cloud Platform, etc.

MATLAB | R | C | C++ | Neuron | Spike2 | LaTeX | Github | HTML

Adobe: Illustrator | Photoshop | InDesign | Lightroom

### **Awards & Fellowships**

2020 Neural Control of Movement Award

to attend NCM meeting at Dubrovnik, Croatia (canceled).

Italian Academy of Columbia University-first rank scholar

- to perform a scholarly research at Columbia University.

2019 Kavli - Society for Neuroscience Award

to attend Society for Neuroscience meeting at Chicago, USA.

2019 Chateaubriand Fellowship

- short term fellowship by the Embassy of France in the US to perform a fMRI research project in ÉNS, Paris, France.

2019 FENS-Japanese Neuroscience Society Award

for top 5 abstracts of the JNS meeting at Niigata, Japan.

2018 Trainee Professional Development Award

for highest rated abstracts of the SfN meeting at San Diego, USA.

2018 AANA Travel Award

to attend IISc national alumni meeting at Chicago, USA.

2018 Gordon Research Seminar on Cognition poster award

- third place.

2018 Kavli - Society for Neuroscience Award

- to attend SfN meeting at San Diego, USA. (declined).

2018 FENS-IBRO/PERC Award

- for highest rated abstracts of the FENS meeting at Berlin.

2018 COSYNE Award

for top 4% abstracts of the COSYNE meeting at Denver, USA.

2017 Australasian Neuroscience Society Award

to attend ANS meeting at Sydney, Australia.

2017 Kavli - Society for Neuroscience Award

to attend SfN meeting at Washington D.C., USA.

2011 Kishore Vaigyanik Protsahan Yojana Fellowship

4 years fellowship by Department of Science and Technology, Government of India.

#### Other Interests

Traveling -traveled to 30+ countries in 6 continents

Languages - Tamil (native), English (bilingual), Hindi (bilingual), Spanish (C2), French (B2), Italian (A2), Sanskrit (read & write), Arabic (read & write) | Graphic design -10+ years experience as head designer for magazine, and freelancing | Photography - landscape and portrait | Visual art -painting in water medium and charcoal | Music -piano, mirudangam (Indian drum) | Health & fitness

## References

**<u>Dr. Michael E. Goldberg</u>** Columbia University | meg2008 @columbia.edu Dr. Jeffery D. Schall Vanderbilt University | jeffrey.d.schall@vanderbilt.edu Dr. Aditya Murthy Indian Institute of Science | adi@iisc.ac.in

## **Profile**

Computational neuroscientist with 8+ years of experience in developing and using computational and machine learning tools to work with unstructured data. Have successfully led several data-driven research projects from conception to deployment by working independently and through collaborations. Have presented key findings effectively at multiple national and international platforms through posters and as invited guest speaker.

## **B.S. Biology and Chemistry**

Indian Institute of Science, M.A. Neurobiology and Behavior Bangalore, India Columbia University, New York, USA

Ph.D. Neurobiology and Behavior Columbia University, New York, USA

#### Selected projects and scientific experience

#### How does Garry Kasparov play chess? - Neural correlates of reinforcement learning

- Designed novel cognitive and decision making paradigms to train primates. Engineered algorithms and developed software to track eye movements, hand movements and licking behavior simultaneously interfaced with neural recordings. Provided the first evidence in 50 years, for a reinforcement error signal in the Purkinje-cell simple spikes using reinforcement learning and drift diffusion models, machine learning tools, quantitative and computational analyses in Python and MATLAB [article]. Presented these findings in front of a large audience in a podium talk [YouTube] among other scenarios.
- Built a stand alone spike sorting software that automatically classifies neural waveforms into simple and complex spikes with very little training data using CNN and unsupervised learning in Tensorflow [manuscript under preparation].
- Modeled learning related changes in high-dimensional state-space and studied the nonlinear mixed selective interaction of choice and reward, using dimensionality reduction and subspace geometry through principle component analysis [article].
- Reversibly, pharmacologically inactivated different areas of cerebellum, and showed its causal necessity in reinforcement learning [article].

#### Did Stephen Hawking wink or blink? - Cortical neural correlates of goal-directed vs spontaneous saccadic eye movements

Developed advanced eye tracking algorithms and used simultaneously recoded neural activity and beta frequency of local field potential, to delineate the differences in the mechanisms of generating non-goal directed and goal-directed eye movements [article].

#### How does David Beckham know where to hit the football? - Mechanisms of visuomotor transformation and motor planning

Analyzed simultaneously recorded neural signals, time series and frequency information in the local field potential to study the mechanisms of visuomotor transformation in the primate frontal eye fields [article].

#### What makes Mike Tyson so good at boxing? - Decreases in variability across multiple timescales during cortical computations to enable efficient behavioral performance

Built biologically inspired computational neuronal models to investigate the neural variability within and across trials during cortical computations. Tested these model predictions on cortical neural activity and behavior in cognitive and motor tasks [article].

## How did Beethoven play the Sonata? - Mechanisms of planning sequential movements

Studied the mechanisms of planning sequential movements in the primate cortex using several computational analyses in python and MATLAB, state-space models and unsupervised machine learning tools [two manuscripts under preparation].

# Selected leadership and professional experience

## Co-chair and co-founder, Undergraduate Alumni Council, IIScAANA

- Built and facilitated successful professional relationships between students and alumni.
- Organized monthly talks by senior alumni around the world.

## Trained and mentored 7 undergraduate interns over 4 years.

Took initiatives to design new projects. Guided and advised them to come up with innovative solutions. Developed their quantitative, debugging, problem solving and communication skills. Provided continuous feedback and evaluated their performance.

# Co-founder and head graphic designer, Quarks, the official undergraduate magazine of IISc

- Formulated the vision and mission of the organization.
- Developed creative detail oriented ideas and solution through critical thinking.
- Successfully increased the organization's size from 4 members to 40 by changing the focus to recruit creative and self driven individuals.

## Head graphic designer, Pravega, the annual science and cultural festival of IISc

- Led a team of designers and generated actionable insights.
- Resolved problems and managed relations.

## Data analytics related short-term projects

- Employed several supervised learning algorithms such as SVM, logistic regression, Random forest etc to classify art as fake vs legitimate [link].
- Implemented a Naive Bayes model for text classification to identify spam emails [link].
- Designed a word prediction and sentence completion algorithm using a n-gram mode.
- Utilized a knn algorithm to classify behavioral metrics such as ballistic saccadic eye movements made by primates [article].
- Developed many data mining, statistical data analysis and data visualization tools [link] [link].

## **Publications**

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manuscripts [9+5] ● podium talks [13] ● poster-abstracts [15]
manuscripts (published/under review)
2020
        Causal evidence for mixed selectivity in the mid-lateral cerebellum to enable reinforcement learning
        Sendhilnathan, N. Ipata, A. E. & Goldberg, M. E. | under review in Cell
2020
        Neural correlates of goal-directed and non-goal-directed movements
        Sendhilnathan, N.*, Basu, D., Goldberg, M. E., Schall, J. D. & Murthy, A.* | bioRxiv; under final review in PNAS
        Assessing within trial and across trial neural variability in macaque frontal eye fields and their relation to behavior
2020
        Sendhilnathan, N.<sup>‡</sup>, Basu, D. & Murthy, A.<sup>‡</sup> | European Journal of Neuroscience
2020
        Neural correlates of reinforcement learning in mid-lateral cerebellum
        Sendhilnathan, N.<sup>‡</sup> Ipata, A. E.* & Goldberg, M. E.* | Neuron
2020
        The mid-lateral cerebellum is required for reinforcement learning
        Sendhilnathan, N.<sup>‡</sup> & Goldberg, M. E. | bioRxiv
        2019
2019
        Mid-lateral Cerebellar Purkinje Cells Provide a Cognitive Error Signal When Monkeys Learn a New Visuomotor Association
        Sendhilnathan, N.*, Ipata, A. E.* & Goldberg, M. E.* | bioRxiv
2018
        Electrophysiological evidence for cerebellar involvement in higher-order cognitive processing
        Sendhilnathan, N.*, Semework, M., Goldberg, M. E.* & Ipata, A. E.* | bioRxiv
2017
        Simultaneous analysis of LFP and spikes reveals essential components of a visuomotor transformation process in frontal eye field
        Sendhilnathan, N., Basu, D. & Murthy, A.* | PNAS
*Corresponding author. * These authors contributed equally
podium talks
       Differential cortical control of goal-directed and non-goal directed saccades (selected), Monsoon brain meeting (on line talk due to COVID-19)
2020
2020
        Neural correlates of reinforcement learning in mid-lateral cerebellum (invited), Indian Institute of Science, Bangalore, India
2019
        Cognitive learning related changes in activity profiles of mid-lateral cerebellar Purkinie cells (selected), JNS meeting, Niigata, Japan
2019
        Neural signature of purposive and nonpurposive movements (invited), Beijing Normal University, Beijing, China
2019
        Mid-lateral cerebellum provides a cognitive error signal when monkeys learn a new visuomotor association (selected), ISN meeting, Eilat, Israel
2018
        Cerebellum for jocks and nerds alike (selected), Columbia University Neurobiology and Behavior program retreat, Palisades, NY
2018
        Mid-lateral Cerebellum Provides a Cognitive Error Signal During Acquisition of New Visuomotor Association (invited), ESI, Frankfurt, Germany
2018
        Does the Cerebellum contribute to cognitive processes? (invited), University of Pisa, Pisa, Italy
        Does the Cerebellum contribute to cognitive processes? (invited), IMT School for Advanced Studies, Lucca, Italy
2018
2018
        Electrophysiological evidence for cerebellar involvement in higher-order cognitive processing (invited), SPAD meeting, Pisa, Italy
2018
        Mid-lateral Cerebellar Purkinje Neurons Participate in Visuomotor Associative Learning (selected), COSYNE 2018, Denver, USA
2016
        Simultaneous Analyses of LFP and Spikes from Monkey Frontal Eye Field to Understand Visuomotor Transformation (invited), University of Pisa, Pisa, Italy
2016
        Visuomotor transformation in Frontal Eye Fields (invited), Bharathidhasan University, Trichy, India
abstracts
2020
        Sendhilnathan, N., Basu, D. & Murthy, A. | Indian Academy of Neuroscience, Hyderabad, India (on line due to COVID-19)
2020
        Sendhilnathan, N., Ipata, A. E. & Goldberg, M. E. | Bernstein Conference, (on line due to COVID-19)
2020
        Sendhilnathan, N., & Goldberg, M. E. | Neural control of movement meeting, Dubrovnik, Croatia (canceled due to COVID-19)
2019
        Sendhilnathan, N., Basu, D., Goldberg, M. E. & Murthy, A. | Society for Neuroscience meeting, Chicago, USA
2019
        Sendhilnathan, N., & Goldberg, M. E. | Zuckerman Institute Mind Brain Behavior Symposium, New York, USA
2018
        Sendhilnathan, N., & Goldberg, M. E. | Society for Neuroscience meeting, San Diego, USA
2018
        Sendhilnathan, N., & Goldberg, M. E. | Annual Harkness Summer Science Fair, Columbia University Medical Center, New York, USA
2018
        Sendhilnathan, N., & Goldberg, M. E. | Gordon Research Seminar, Maine, USA
2018
        Sendhilnathan, N., & Goldberg, M. E. | Federation of European Neuroscience Societies annual meeting, Berlin, Germany
2018
        Sendhilnathan, N., & Goldberg, M. E. | Sense2Synapse, Rockefeller University, New York, USA
2017
        Sendhilnathan, N., Ipata, A. E., Semework, M. & Goldberg, M. E. | Australasian Neuroscience Society, Sydney, Australia
2017
        Sendhilnathan, N., Semework, M., Goldberg, M. E.* & Ipata, A. E.* | Society for Neuroscience meeting, Washington D.C.
2017
        Sendhilnathan, N., Semework, M., Goldberg, M. E.* & Ipata, A. E.* | Neural Control of Movement meeting, Dublin, Ireland
2016
        Sendhilnathan, N., Basu, D. & Murthy, A. | Society for Neuroscience, San Diego, USA
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#### Scientific media coverage

2020 My Neuro news

2015

2020 What is the cerebellum? (News coverage by Columbia University's Zukerman institute)

Ipata, A. E., Sendhilnathan, N., King, A. & Goldberg, M. E. | Society for Neuroscience, Chicago, USA

- 2020 Research on cerebellum yields rewards (Nature news & views)
- 2018 <u>Talk at the COmputational and SYstems NEuroscience meeting (COSYNE 18)</u>