# Michael D. Nunez, Ph.D.

Assistant Professor Psychological Methods University of Amsterdam

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<b>EDUCATION</b> University of California, Irvine 2017 - Ph.D. in Psychology w/ Concentration in Cognitive Neuroscience 2017 - M.S. in Cognitive Neuroscience	Cognitive Sciences Department
University of California, Irvine 2015 - M.S. in Statistics	Statistics Department
<i>Tulane University, New Orleans, LA</i> 2010 - B.S. in Mathematics and Economics (Double Major, cum laude), Minor in Psychology	Mathematics Department
EMPLOYMENT HISTORY Assistant Professor Psychological Methods Group Department of Psychology University of Amsterdam	July 2021 - Present
I develop my own research program on neurocognitive modeling, decision-making and other to undergraduate courses, as well as mentor Masters and Bachelor students.	opics. I also teach graduate and
Assistant Project Scientist, Cognition and Individual Differences Lab, Human Neuroscience La PIs: Prof. Joachim Vandekerckhove, Prof. Ramesh Srinivasan Department of Cognitive Sciences University of California, Irvine I developed and found parameter estimates of neurocognitive models using human EEG and be	
Assistant Project Scientist, Fuster Laboratory of Cognitive Neuroscience PI: Prof. Michele A. Basso Department of Psychiatry and Biobehavioral Sciences University of California, Los Angeles (UCLA) I studied decision making from recordings of neurons, intracranial data, and behavioral data in	Feb 2019 - July 2020
Assistant Project Scientist, Cognition and Individual Differences Lab, Human Neuroscience La PIs: Prof. Joachim Vandekerckhove, Prof. Ramesh Srinivasan Department of Cognitive Sciences University of California, Irvine	
I sought to estimate unidentified cognitive models of human decision making with experimenta EEG.	a ochavior and scalp-recorded
Associate Specialist, Laboratory of Computational and Translational Neuroscience PI: Prof. Beth A. Lopour Department of Biomedical Engineering University of California, Irvine I classified and statistically modeled markers of epilepsy in human patients using electric poter cortex.	Sep 2017 - May 2018

Graduate Student Researcher, Human Neuroscience Lab, Cognition and Individual Differences Lab

PIs: Prof. Ramesh Srinivasan, Prof. Joachim Vandekerckhove Department of Cognitive Sciences

University of California, Irvine

I tested the veracity of combined electrocortical and cognitive models of human visual attention and decision-making. This was typically performed in a hierarchical Bayesian statistical framework with statistical models of EEG and human behavior.

Teaching Assistant, Cognitive Sciences Department

University of California, Irvine

I was responsible each academic quarter to fulfill the duties of a teaching assistant as needed by the instructor of the course. I held discussion courses for undergraduates each week as well as provided office hours and graded papers, homework, and exams.

Research Assistant, Psychology Department PI: Prof. Edward Golob

# Tulane University, New Orleans, LA

I sought to advance understanding of normal cognitive aging by exploring condition differences in auditory EEG Event Related Potentials obtained from Independent Component Analysis (ICA).

# **PROFESSIONAL SKILLS**

### Modeling:

- Neurocognitive models / Model-based Cognitive Neuroscience (mathematical cognitive models of brain and behavior)
- Mathematical Psychology (mathematical cognitive models of human and Rhesus macaque behavior) 0
- Computational Neuroscience (statistical models of scalp and intracranial EEG, LFPs and population activity)
- Statistics:
  - Bayesian model fitting (MCMC, Amortized Bayesian Inference, Bayesian model comparison, Bayes Factor calculations)
  - 0 Hierarchical Bayesian models and Bayesian structural equation modeling
  - Classical (Frequentist) statistical methods 0
  - Machine Learning, Artificial Neural Networks, Time Series, etc. 0

# Neuroimaging:

- EEG (recording with EGI and ANT hardware and software, OpenVibe, ICA artifact correction, ERPs, SSVEPs, source analysis, Brain-Computer Interfaces, custom Python and MATLAB functions, EEGLAB, etc.)
- ECoG / iEEG (analysis of intracranial recordings from epileptic patients using custom Python and MATLAB functions) 0
- Single unit electrophysiology (implantation of depth electrodes, finding of receptive fields, electrical noise reduction) 0
- 0 fMRI (operating the MRI machine, nibabel, nilearn, SPM, analyzing structural MRI images, BrainSight)
- Brain-Computer Interfaces / Adaptive Neurotechnologies (OpenVibe, Visual Evoked Potentials, SSVEPs, familiarity 0 with BCI hardware, BCI start-up company involvement)
- Eve tracking (infrared eve tracking of pupil and infrared reflection, eve tracking in monkeys using implanted eve coils) 0
- Additional Mathematics: Signal Processing, Linear Algebra, Multivariate Calculus, etc.
- **Programming**:
  - Python (advanced knowledge: Numpy, Scipy, Tensorflow, etc. public Github scripts)
  - R (advanced knowledge: base, dplyr, etc., built MCMC samplers, public Github scripts)
  - 0 MATLAB (advanced knowledge: public Github repositories, experimental designs)
  - C++ (working knowledge: building experimental stimuli) 0
  - Stan, JAGS, Github, git, Linux Bash, html (lab website maintenance), julia (learning), REX/VEX 0
- Experimental design: Design and implementation for human participants and Rhesus macaques •
- Teaching: Teaching of undergraduate and graduate students in statistics, programming, experimental design, scientific writing, etc. Netherlands University Teaching Qualification (BKO).
- Mentorship: Mentoring of undergraduate, graduate students, and laboratory assistants from diverse backgrounds •
- Data analysis: Preparing and organizing large data sets, dimension reduction, statistical modeling, etc. •
- **Open science**: Sharing of code and data with github.com and osf.io, preregistration of scientific experiments, sharing of • open-access papers, conference posters, etc. on preprint and postprint websites
- Animal lab / Veterinary care: Hands-on experience caring for, cleaning implants of, training, and building experiments for • Rhesus macaques. Preparing and recording neural data from the cortex and midbrain in Rhesus macaques using depth electrodes.

Sep 2012 - Dec 2016

2011 - 2012

#### PUBLICATIONS

- Nunez, M. D., Fernandez, K., Srinivasan, R., & Vandekerckhove, J. (2024). <u>A tutorial on fitting joint models of M/EEG and behavior to understand cognition</u>. *Behavior Research Methods*. doi: 10.3758/s13428-023-02331-x
- Vo, K., Sun, Q. J., Nunez, M. D., Vandekerckhove, J., & Srinivasan, R. (2024). <u>Deep latent variable joint cognitive modeling</u> of neural signals and human behavior. *NeuroImage*. doi: 10.1016/j.neuroimage.2024.120559
- Nunez, M. D., Schubert, A.-L., Frischkorn, G. T., Oberauer, K. (2023). <u>Cognitive models of decision-making with</u> <u>identifiable parameters: Diffusion Decision Models with within-trial noise</u>. *PsyArXiv*. doi: 10.31234/osf.io/h4fde
- Alanis, J. C. G., Nunez, M. D., Wehrheim, M. H., Fiebach, C., Löffler, C., & Schubert, A. L. (2023). <u>The Devil's in the Variability: A Multidimensional Analysis of EEG Signal Dynamics and Their Relation to Behaviour</u>. *PsyArXiv*. doi: 10.31234/osf.io/4ug3y
- Ghaderi-Kangavari, A., Rad, J. A., Nunez, M. D. (2023). <u>A general integrative neurocognitive modeling framework to jointly describe EEG and decision-making on single trials</u>. *Computational Brain & Behavior*, 6, 317–376. doi: 10.1007/s42113-023-00167-4
- Ghaderi-Kangavari, A., Parand, K., Ebrahimpour, R., **Nunez, M. D.,** Rad, J. A. (2023). <u>How spatial attention affects the decision process: looking through the lens of Bayesian hierarchical diffusion model & EEG analysis</u>. *Journal of Cognitive Psychology*, 35:4, 456-479. doi: 10.1080/20445911.2023.2187714
- Ghaderi-Kangavari, A., Rad, J. A., Parand, K., Nunez, M. D. (2022). <u>Neuro-cognitive models of single-trial EEG measures</u> describe latent effects of spatial attention during perceptual decision making. *Journal of Mathematical Psychology*, 111, 102725. doi: 10.1016/j.jmp.2022.102725
- Nunez, M. D., Charupanit, K., Sen-Gupta, I., Lopour, B. A., Lin, J. J. (2022). <u>Beyond rates: Time-varying dynamics of high frequency oscillations as a biomarker of the seizure onset zone</u>. *Journal of Neural Engineering*. 19, 016034. doi: 10.1088/1741-2552/ac520f
- Jun, E. J.\*, Bautista, A. R.\*, Nunez, M. D.\*, Allen, D. C., Tak, J. H., Alvarez, E., Basso, M. A. (2021). <u>Causal role for the primate superior colliculus in the computation of evidence for perceptual decisions</u>. *Nature Neuroscience*, 24, 1121–1131. doi: 10.1038/s41593-021-00878-6 \*Contributed Equally
- Lui, K. K., Nunez, M. D., Cassidy, J. M., Vandekerckhove, J., Cramer, S. C., & Srinivasan, R. (2021). <u>Timing of readiness</u> potentials reflect a decision-making process in the human brain. *Computational Brain & Behavior*, 4, 264–283 (2021). doi: 10.1007/s42113-020-00097-5
- Nunez, M. D., Gosai, A., Vandekerckhove, J., & Srinivasan, R. (2019). The latency of a visual evoked potential tracks the onset of decision making. *NeuroImage*, doi: 10.1016/j.neuroimage.2019.04.052.
- Nunez, P. L., Nunez, M. D., & Srinivasan, R. (2019). <u>Multi-Scale Neural Sources of EEG: Genuine, Equivalent, and Representative. A Tutorial Review. Brain Topography</u>, 32, 193–214. doi: 10.1007/s10548-019-00701-3
- Schubert, A. L., Nunez, M. D., Hagemann, D., & Vandekerckhove, J. (2019). <u>Individual differences in cortical processing</u> speed predict cognitive abilities: A model-based cognitive neuroscience account. *Computational Brain & Behavior*, 2, 64–84. doi: 10.1007/s42113-018-0021-5
- Bridwell, D. A., Cavanagh, J. F., Collins, A. G., Nunez, M. D., Srinivasan, R., Stober, S., & Calhoun, V. D. (2018). Moving Beyond ERP Components: A Selective Review of Approaches to Integrate EEG and Behavior. Frontiers in Human Neuroscience, 12, 106. doi: 10.3389/fnhum.2018.00106
- Nunez, M. D., Vandekerckhove, J., & Srinivasan, R. (2017). <u>How attention influences perceptual decision making:</u> <u>Single-trial EEG correlates of drift-diffusion model parameters</u>. *Journal of Mathematical Psychology*. 76:B, (pp. 117-130), doi: 10.1016/j.jmp.2016.03.003
- Nunez, M. D. (2017). <u>Refining understanding of human decision making by testing integrated neurocognitive models of</u> <u>EEG, choice and reaction time</u> (Doctoral dissertation, UC Irvine).
- Nunez, M. D., Nunez, P. L., & Srinivasan, R. (2016) <u>Electroencephalography (EEG)</u>, <u>neurophysics</u>, <u>experimental methods</u>, and <u>signal processing</u>. In Ombao, H., Linquist, M., Thompson, W. & Aston, J. (Eds.) Handbook of Neuroimaging Data Analysis (pp. 175-197), Chapman & Hall/CRC. Advance online publication. doi: 10.13140/rg.2.2.12706.63687
- Nunez, M. D., Srinivasan, R. & Vandekerckhove, J. (2015). <u>Individual differences in attention influence perceptual decision</u> making. *Frontiers in Psychology.* 8:18. doi: 10.3389/fpsyg.2015.00018

#### **CONFERENCE PUBLICATIONS**

- Sun, Q. J., Vo, K., Lui, K., Nunez, M. D., Vandekerckhove, J., & Srinivasan, R. (2022) <u>Decision SincNet: Neurocognitive</u> models of decision making that predict cognitive processes from neural signals. International Joint Conference on Neural Networks (IJCNN) Proceedings 2022. doi: 10.48550/arXiv.2208.02845
- Nunez, M. D., Gosai, A., Vandekerckhove, J. & Srinivasan, R. (2017). <u>EEG measures of neural processing speed reflect</u> <u>human visual encoding time</u>. Conference on Cognitive Computational Neuroscience. New York, New York. September 2017.
- Charupanit, K., **Nunez, M. D.**, Bernardo, D., Bebin, E. M., Krueger, D. Northrup, H., Sahin, M., Wu, J. Y., & Lopour, B. A. (2018). <u>Automated Detection of High Frequency Oscillations in Human Scalp Electroencephalogram</u>. International

Conference of the IEEE Engineering in Medicine and Biological Society. Honolulu, Hawaii. pp. 3116-3119, doi: 10.1109/EMBC.2018.8513033.

### SELECTED CONFERENCE PRESENTATIONS

- Nunez, M.D. Pinier, C., Ghaderi-Kangavari, A. <u>When does evidence accumulation begin after a visual stimulus? Evidence from neurocognitive modeling of EEG and behavior</u>, July 2023. Presented at the Society for Mathematical Psychology. University of Amsterdam, Netherlands.
- Ghaderi-Kangavari, A., Rad, J. A., Nunez, M. D. Integrative neurocognitive approaches to understanding cognition through simultaneous analysis of EEG and behavioral data on single trials. Presented at the Society for Mathematical Psychology. University of Amsterdam, Netherlands July 2023.
- Ghaderi-Kangavari, A., Rad, J. A., Nunez, M. D. <u>Novel neuro-cognitive models can explore spatial attention's effect on</u> <u>perceptual decision making</u>. Presented at the Virtual Meeting of the Society for Mathematical Psychology, July 2022.
- Nunez, M.D. Developing neurocognitive models of joint EEG and behavioural data during perceptual decision-making. Presented at the Virtual Neuromatch 4.0 Conference, November 2021.
- Nunez, M. D., Srinivasan, R., Vandekerckhove, J. <u>Recovering parameters of joint models of human EEG and behavior</u> <u>during decision making</u>. Presented at the Virtual Meeting of the Society for Mathematical Psychology, July 2021.

#### SELECTED CONFERENCE POSTERS

- Özsezer, P., van der Maas, H., **Nunez, M. D.**. <u>Cascading transitions in multistable perception and cognition</u>. Presented at the Society for Mathematical Psychology. University of Amsterdam, Netherlands July 2023.
- Volz, L., Matzke, D., Nunez, M. D., Heathcote, A. Comparing Amortized to MCMC-based Bayesian Inference for Cognitive Models of the Stop-Signal Paradigm. Presented at the Society for Mathematical Psychology. University of Amsterdam, Netherlands July 2023.
- Pinier, C., Nunez, M. D. Exploration of a potential relationship between the N200 peak-latency and visual encoding time. Presented at the Meeting of the European Mathematical Psychology Group 2022 in Trento, Italy.
- Nunez, M. D., Tisby, M. K., Lui, K. K., Vandekerckhove, J., Srinivasan, R. <u>A macro-level perspective on evidence</u> accumulation during decision making. Presented at the Society for Neuroscience Global Connectome Virtual Event, January 2021.
- Sun, Q. J., Nunez, M. D., Vandekerckhove, J., & Srinivasan, R. <u>Using interpretable convolutional neural network on EEG to predict trial-level response time in perceptual decision making</u>. Presented at the Virtual Society for Neuroscience 2021 meeting.
- Nunez, M. D., Kapre, K., Grimaldi, P., Hakwan, L., Basso, M. A. Prefrontal cortex neuronal ensemble activity encodes confidence. Presented at the Summer School for Primate Cognitive Neuroscience. Bad Bevensen, Germany, August 2019.
- Nunez, M. D., Charupanit, K., Lin, J. J., Lopour, B. A. <u>Temporal dynamics of high frequency oscillations at slow and fast</u> <u>time scales in patients with epilepsy</u>. Presented at the American Epilepsy Society. New Orleans, LA, December 2018.
- Nunez, M. D., Scambray, K. A., Lui, K. K., Vandekerckhove, J., Srinivasan, R. <u>The time course of brain signals reflect</u> <u>different cognitive processes during human decision making</u>. Presented at the Society for Neuroscience. San Diego, CA, November 2018.
- Nunez, M. D., Vandekerckhove, J., Srinivasan, R. <u>The cognitive chronometry of rapid human decision making</u>. Presented at the Society for Neuroscience. Washington, DC, November 2017.

#### FUNDED GRANT PROPOSALS

- University of Amsterdam Starting Grant 2023 "Extending AI models of abstract reasoning to jointly understand human brain, cognition, and behavior" ( $\in$  300 EUR). I wrote this grant with Claire E. Stevenson and Dora Matzke
- *NWO SGW Open Competitie 2021 "Cascading transitions in multistable perception and cognition"* (€ 285 EUR). I wrote this grant proposal with Han van der Maas (project lead), Raoul Grasman, and Simon van Gaal.
- NSF Methodology, Measurement, and Statistics Proposal 2021 "Exploratory and confirmatory neurocognitive modeling with latent variables" (~\$345K USD) I wrote this grant proposal along with Joachim Vandekerckhove and Ramesh Srinivasan based on a new modeling framework and preliminary results.
- <u>NSF Cognitive Neuroscience Proposal 1850849 "Critical tests of neurocognitive relationships"</u> (\$675K USD) I wrote this grant proposal along with Joachim Vandekerckhove and Ramesh Srinivasan based on my work on the previous grant.
- <u>NSF Cognitive Neuroscience Proposal 1658303 "Estimation of unidentified cognitive models with physiological data"</u> (\$337K USD) I wrote this grant along with Joachim Vandekerckhove and Ramesh Srinivasan based on my PhD materials.

#### SELECTED SOFTWARE

- <u>https://github.com/mdnunez/pyhddmjags</u> Python repository for example Hierarchical Drift Diffusion Model (HDDM) code using JAGS and Stan
- <u>https://github.com/mdnunez/artscreenEEG</u> MATLAB repository to perform basic artifact correction on electroencephalographic (EEG) data

### **TEACHING / PEDAGOGY**

#### Teaching Certification: Netherlands University Teaching Qualification (BKO)

- *Programming in Psychological Science* (UvA), Jan-Feb 2022-2024: I teach Psychology Research Masters students introductory programming in both R and Python. Course materials are available here: <u>https://github.com/mdnunez/PIPS\_course</u>
- *Research Design & Statistics* (UvA), Nov-Dec 2021-2023: I teach Brain & Cognition Masters students to conduct statistical inference and analyze data in R and JASP.
- Behavioural Research Toolbox / Simulation Models, Methods & Statistics (UvA), Sep-Oct 2021-2023: I teach students in this undergraduate course to simulate from statistical distributions and models in Python and R, as well as conduct statistical analysis and build experiments
- *Model-based Neuroscience Summer School,* July 2022/2023: I taught sessions to mainly PhD students / Postdocs on the topic of joint models of EEG and behavior.
- Sixth European Summer School on Computational and Mathematical Modeling of Cognition, July 2022: I mentored PhD students on their own computational modeling projects. I also taught sessions on Python programming, Bayesian statistics, and joint models of EEG and behavior.
- *Bayesian Statistics (UvA)*, June 2022: I co-taught a theoretical basis and principles of Bayesian Statistical analysis to approximately 70 undergraduates.
- *Neuromatch Academy Project Mentor*, Summer 2021: I advised 5 PhD students from various backgrounds on a project to use High Frequency Oscillations (HFOs) in the Fusiform Face Area using ECoG/iEEG data to predict face perception.
- *History of Neuroscience* (UCI), Fall 2016: I answered student questions, graded quizzes and exams.
- *Probability and Statistics III in MATLAB* (UCI), Spring 2015: I held discussion sections and office hours and taught students statistical algorithms and topics such as bootstrapping.
- *Introductory Statistics* (UCI), Falls of 2012 and 2014: I taught lab and discussion sections as well as met with students individually and in group review sessions.
- *Experimental Methods* (UCI), Winter 2012, Spring 2013, Winter 2013: I was responsible for lab and discussion sections as well as helping students with their writing and research projects.

#### WORKSHOPS

• Bayesian cognitive modeling using the R-package brms - Given for the European Society for Cognitive Psychology 2022

### **COMMITTEE MEMBERSHIPS & ORGANIZATION ROLES**

- UvA Psychology Scientific Advisory Board (active)
- UvA Psychology Diversity and Inclusivity Committee (active)
- Society for Mathematical Psychology 2023 Conference Chair

#### PROFESSIONAL MEMBERSHIPS

- <u>Society for Mathematical Psychology</u> (active)
- <u>The Cognitive Science Society</u> (active)
- IOPS: InterUniversity Graduate School of Psychometrics and Sociometrics (active)
- European Society of Cognitive Psychology (inactive)
- Society for Neuroscience (inactive)
- American Epilepsy Society (inactive)

#### **GROUP MEMBERSHIPS**

- Mathematical Cognitive Neuroscience Laboratory (active)
- <u>Amsterdam Mathematical Psychology Laboratory</u> (active)
- Amsterdam Brain and Cognition (active)