Charles C. Margossian

Research interest

Bayesian modeling; Bayesian workflow; Hierarchical models; ODE-based models; Markov chain Monte Carlo; Variational Inference; Integrated Laplace approximations; Automatic differentiation; Pharmacometrics; Epidemiology; Statistical Physics; Probabilistic programming (Stan, Torsten, TensorFlow Probability)

Education

- 2017–2022 Ph.D. Statistics, Columbia University, New York, NY.
 - o Thesis: Modernizing Markov chains Monte Carlo for scientific and Bayesian modeling
 - o Advisor: Andrew Gelman
 - o Dissertation Committee: Aki Vehtari, Matthew Hoffman, Sumit Mukherjee, David Blei
- 2011–2015 **B.Sci. Physics**, Yale University, New Haven, CT.
- 2009–2011 Baccalauréat Scientifique, Ecole Jeannine Manuel (High school), Paris, France.

Appointments

- 2022—present **Research Fellow**, Flatiron Institute, Center for Computational Mathematics, Simons Foundation, New York, NY.
- Summer 2021 Research Intern, Google Research, Bayesflow team, New York, NY.
- Summer 2019 Visiting Doctoral Student, Aalto University, Department of Computer Science, Probabilistic Machine Learning group, Espoo, Finland.
 - 2015–2017 **Visiting Scientist**, Metrum Research Group LLC, Pharmacometrics, Tariffville, CT and Cambridge, MA.
 - 2013–2015 Research Assistant, Yale University, Department of Astronomy, New Haven, CT.
- Summer 2014 Patent Law, Technical Specialist, Leinweber & Zimmermann, Munich, Germany.

Academic services

2023 - present Stan Governing Body.

2016 - present Stan-Math core developer, Stan development team.

2019 - present **Reviewer**, Computational Statistics (2022), Nature (2021), AISTATS (2021), Methods in ecology (2021), Journal of data science (2021), NeurIPS (2020), Journal of pharmacokinetics and pharmacodynamics (2019).

Skills

Progamming: R, Python, C++, Stan, TensorFlow Probability, LATEX, GitHub Languages: English, French, German

Preprints

- [1] Charles C Margossian and David M Blei. Amortized Variational Inference: When and Why? arXiv:2307.11018, 2023.
- [2] Charles C Margossian. General adjoint-differentiated Laplace approximation. arXiv:2306.14976, 2023.
- [3] Chirag Modi, **Charles C Margossian**, Yuling Yao, Robert Gower, David Blei, and Lawrence Saul. Variational Inference with Gaussian Score Matching. arXiv:2307.07849, 2023.
- [4] Charles C Margossian, Matthew D Hoffman, Pavel Sountsov, Lionel Riou-Durand, Aki Vehtari, and Andrew Gelman. Nested \hat{R} : Assessing the convergence of Markov chain Monte Carlo when running many short chains. arXiv:2110.13017, 2022.
- [5] **Charles C Margossian** and Michael Betancourt. Efficient Automatic Differentiation of Implicit Functions. *arXiv:2112.14217*, 2022.
- [6] Charles C Margossian and Sumit Mukherjee. Simulating Ising and Potts models at critical and cold temperatures using auxiliary Gaussian variables. arXiv:2110.10801, 2021.
- [7] Andrew Gelman, Aki Vehtari, Daniel Simpson, **Charles C Margossian**, Bob Carpenter, Yuling Yao, Lauren Kennedy, Jonah Gabry, Paul-Christian Bürkner, and Martin Modrák. Bayesian Workflow. arXiv:2011.01808, 2020.
- [8] Michael Betancourt, **Charles C Margossian**, and Vianey Leos-Barajas. The Discrete Adjoint Method: Efficient Derivatives for Functions of Discrete Sequences. *arXiv:2002.00326*, 2020.

Published papers

- *: Supervised student
- [1] Charles C Margossian and Lawrence K Saul. The Shrinkage-Delinkage Trade-off: An Analysis of Factorized Gaussian Approximations for Variational Inference. Selected for Oral Presentation, Uncertainty in Artificial Intelligence, 2023.
- [2] Lionel Riou-Durand, Pavel Sountsov, Jure Vogrinc, **Charles C Margossian**, and Sam Power. Adaptive Tuning for Metropolis Adjusted Langevin Trajectories. *Artificial Intelligence and Statistics*, 2023.
- [3] Charles C Margossian, Yi Zhang, and William R Gillespie. Flexible and efficient Bayesian pharmacometrics modeling using Stan and Torsten, Part I. CPT: Pharmacometrics & Systems Pharmacology, 11:1151 1169, 2022.

- [4] Philip Greengard, Jeremy Hoskins, **Charles C Margossian**, Jonah Gabry, Andrew Gelman, and Aki Vehtari. Fast methods for posterior inference of two-group normal-normal models. *Bayesian Analysis*, 2022.
- [5] Léo Grinsztajn*, Elizaveta Semenova, **Charles C Margossian**, and Julien Riou. Bayesian workflow for disease transmission modeling in Stan. *Statistics in Medicine*, 40:6209 6234, 2021.
- [6] Charles C Margossian, Aki Vehtari, Daniel Simpson, and Raj Agrawal. Hamiltonian Monte Carlo using an adjoint-differentiated Laplace approximation: Bayesian inference for latent Gaussian models and beyond. *Neural Information Processing Systems*, 2020.
- [7] Anthony Hauser, Michel J Counotte, **Charles C Margossian**, Garyfallos Konstantinoudis, Nicola Low, Christian L Althaus, and Julien Riou. Estimation of SARS-CoV-2 mortality during the early stages of an epidemic: a modeling study in Hubei, China and six regions in Europe. *PLOS Medicine*, 17, 2020.
- [8] Charles C Margossian. A Review of automatic differentiation and its efficient implementation. Awarded "Top WIRES articles in 2022", WIRES: Data Mining and Knowledge Discovery, 9, 2019.
- [9] Joseph R Schmitt, Eric Agol, Katherine M Deck, Leslie A Rogers, J Zachary Gazak, Debra A Fischer, Ji Wang, Matthew J Holman, Kian J Jek, Charles Margossian, Mark R Omohundor, Troy Winarski, John M Brewer, Matthew J Giguere, Chris Lintott, Stuart Lynn, Michael Parrish, Kevin Schawinski, Megan E Schwamb, Robert Simpson, and Arfon M Smith. Planet Hunters. VII. Discovery of a new low-mass, low-density planet (PH3 C) orbiting KEPLER-289 with mass measurements of two additional Planets (PH3 B and D). Astrophysical Journal, 795(2), 2014.

Conference notebooks and posters

- *: Supervised student
- [1] Charles C Margossian, Matthew D Hoffman, Pavel Sountsov, Lionel Riou-Durand, Aki Vehtari, and Andrew Gelman. Assessing the convergence of Markov chains Monte Carlo when running many chains. *BayesComp*, 2023.
- [2] Stanislas du Ché* and **Charles C Margossian**. Parallelization for Markov chains Monte Carlo with heterogeneous runtimes. *BayesComp*, 2023.
- [3] **Charles C Margossian**, Lu Zhang, Sebastian Weber, and Andrew Gelman. Solving ODEs in a Bayesian context: challenges and opportunities. *Population Approach Group in Europe*, 2021.
- [4] Aurélien Marc, Marion Kerioui, **Charles Margossian**, Julie Bertrand, Pauline Maisonnasse, Yoan Aldon, Rogier W Sanders, Marit Van Gils, Roger Le Grand, and Jérémie Guedj. Developping a model of SARS-CoV-2 viral dynamics under monoclonal antibody treatment. *Population Approach Group in Europe*, 2021.
- [5] Johann D Gaebler* and **Charles C Margossian**. Propagating Derivatives through Implicit Functions in Reverse Mode Autodiff. Stanford Institute for Computational & Mathematical Engineering, 2021.

- [6] **Charles C Margossian**, Aki Vehtari, Daniel Simpson, and Raj Agrawal. Approximate Bayesian inference for latent Gaussian models in Stan. *StanCon*, 2020.
- [7] **Charles C Margossian** and Andrew Gelman. Bayesian model of planetary motion: exploring ideas for a modeling workflow when dealing with ordinary differential equations and multimodality. In *Stan Case Studies*, volume 7, 2020.
- [8] Charles C Margossian. Computing Steady States with Stan's Nonlinear Algebraic Solver. StanCon, 2018.
- [9] Charles C Margossian and William R Gillespie. Gaining Efficiency by Combining Analytical and Numerical Methods to Solve ODEs: Implementation in Stan and Application to Bayesian PK/PD. American Conference on Pharmacometrics, 2017.
- [10] **Charles C Margossian** and William R Gillespie. Differential Equation Based Models in Stan. StanCon, 2017.
- [11] **Charles C Margossian** and William R Gillespie. Stan Functions for Pharmacometrics Modeling. *American Conference on Pharmacometrics*, 2016.

Software

Core developer, Stan: a probabilistic programming language, mc-stan.org.

Co-creator, Torsten: an extension of Stan for Bayesian pharmacometrics modeling, GitHub link.

 $\begin{tabular}{ll} \textbf{Contributor}, mrgSolve: Simulation from ODE-Based Population PK/PD and System Pharmacology Models, GitHub link. \end{tabular}$

Awards and recognitions

- 2023 **UAI Oral presentation**, For *The Shrinkage-Delinkage Trade-off: An Analysis of Factor-ized Gaussian Approximations for Variational Inference*, top $\sim 15\%$ articles accepted at the conference on Uncertainty in Artificial Intelligence.
- 2022 WIRES Top Article, For A Review of Automatic Differentiation and its Efficient Implementation, which was amongst the top 10 most cited articles in the 2021 Journal Citation Report for WIRES, Data Mining and Knowledge Discovery.
- 2022 Minghui Yu Teaching Assistant Award, Department of Statistics, Columbia University, Awarded by the Director of Graduated Studies based on student feedback.
- 2022 **AISTATS Top Reviewer**, The top reviewers were selected based on the feedback received from the Area Chairs and comprise the top-10% of AISTATS reviewers.
- 2017 **Dean's Fellowship**, Department of Statistics, Columbia University, 5 years funding for PhD degree.
- 2010 Yale Book Award, For "character and intellectual promise".

Supervised research projects

- Stanislas Du Ché (master student), Spring 2022
 Project: Parallelization for Markov chain Monte Carlo with heterogeneous runtimes
- Johann Gaebler (PhD student), Fall 2020
 Project: Propagating Derivatives through implicit functions in reverse mode automatic

${\it differentiation}$

- o Léo Grinsztajn (master student), Summer 2020 Project: Bayesian Workflow for disease transmission models
- Hyunjee Moon (undergraduate student), Summer 2020 Project: Simulation-based Calibration for the embedded Laplace approximation

Teaching experience (selected)

- 2019 2023 **Lecturer**, "Probability and Bayes", PHC 506: Biometry in Pharmaceutics, University of Buffalo, School of Pharmacy, Buffalo, NY.
- 2019 2023 **Instructor**, Building, fitting, and criticizing Bayesian PK/PD models, one-day workshop, University of Buffalo, School of Pharmacy, Buffalo, NY.
- 2019, 2020 **Instructor**, Stan for the people: two days introductory workshop on Bayesian modeling, two-day workshop, McGill University, Montreal, Canada.
- August 2019 Co-instructor, Population and ODE-based models using Stan and Torsten, two-day workshop, StanCon, Cambridge, UK.
- January 2018 Instructor, How to Develop for the Stan C++ Core Language, StanCon, Pacific Grove, CA.
 - April 2017 **Invited Lecturer**, "Introduction to Bayesian Data Analysis with Stan", STAT 220: Bayesian Statistics, Harvard University, Cambridge, MA.
 - 2021, 2022 **Teacher Assistant**, Applied Statistics II, STAT 6102 (PhD level), Columbia University, New York, NY.
 - 2019, 2020 **Teacher Assistant**, Foundation of Graphical Models, STAT 6701 (PhD level), Columbia University, New York, NY.
- Spring 2019 **Teacher Assistant**, Statistical inference, STAT 5204 (Master level), Columbia University, New York, NY.
 - Fall 2018 **Teacher Assistant**, Statistical Computing and Introduction to Data Science (Undergrad level), STAT 4206, Columbia University, New York, NY.
 - September **Teacher Assistant**, Stan for Physics, 5-day workshop, Massachusetts Institute of Technology, Cambridge, MA.
 - June 2017 **Teacher Assistant**, Getting Started with Bayesian PKPD Modeling using Stan and Torsten, Population Approach Group in Europe, Budapest, Hungary.
- October 2016 **Teacher Assistant**, Getting Started with Bayesian PKPD Modeling using Stan, one-day workshop, American Conference on Pharmacometrics, Bellevue, WA.
- October 2015 **Teacher Assistant**, Getting Started with Bayesian PKPD Modeling using Stan, one-day workshop, American Conference on Pharmacometrics, Arlington, VA.
 - 2013–2015 **Peer Tutor**, Science, Technology, and Research Scholars (STARS) program, Yale University, New Haven, CT.

Presentations (selected)

- June 2023 Making Bayesian Pharmacometrics modeling simpler (but not too simple) with Torsten, Stan for Pharmacometrics Day, INSERM, Paris, France.
- June 2023 Amortized Variational Inference: when and why?, Flatiron-wide Meeting on Machine Learning, Flatiron Institute, New York, NY.
- May 2023 From high-performance algorithms to high-performance modeling, Structural and Molecular Biophysics (SMBp) group meeting, Flatiron Institute, New York, NY.
- October 2022 Solving ODEs in a Bayesian model, Flatiron-Wide Algorithms and Mathematics $(F_{\omega}(\alpha + m)!)$, Flatiron Institute, New York, NY.

- July 2022 Nested \hat{R} : Assessing convergence for Markov chains Monte Carlo when running many short chains, Center for Research in Economics and Statistics (CREST), École Polytechnique, Paris, France.
- March 2021 Bayesian inference for latent Gaussian models: MCMC, approximate methods, and hybrids, Minghui Yu memorial conference, Columbia University, New York, NY.
- November Developing a Bayesian modeling workflow for population PBPK, American Con-2020 ference on Pharmacomertrics.
- August 2020 Approximate Bayesian inference for latent Gaussian models in Stan, StanCon.
 - June 2020 **Developing a Bayesian workflow to model the Covid-19 outbreak**, 12th Covid-19 symposium, Columbia University, New York, NY.
 - April 2020 Laplace approximation for speeding up the computation of multilevel models, MRP conference, Columbia University, New York, NY.
- March 2020 Building a probabilistic programming language to diagnose our inference, University of Buffalo, School of Pharmacy, Buffalo, NY.
- July 2018 Understanding automatic differentiation to improve performance, Stan for Pharmacometrics Day, Université Paris Diderot, School of Medicine, Paris, France.
- January 2018 Computing steady states with Stan's nonlinear algebraic solver, StanCon, Pacific Grove, CA.
 - June 2017 **L'Avenir de Stan en pharmacométrie**, Université Paris Diderot, School of Medicine, Paris, France.
- January 2017 **Differential equations based models in Stan**, StanCon, Columbia University, New York, NY.
 - November **Differential equations based models in Stan**, Stan Meetup in Boston, Harvard Uni-2016 versity, Cambridge, MA.
 - February Practice (and malpractices!) of Bayesian analysis, Metrum Journal Minute, Tarif-2016 fville, CT.
 - March 2015 How stars and planets Interact: testing the effects of close-in giant planets on stellar magnetic activity, Davenport Mellon Forum, Yale University, New Haven, CT.

 Modified June 2023