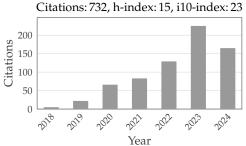
# Ali Siahkoohi

Simons Postdoctoral Fellow Dept. of Comp. Applied Math. & Operations Research Rice University alisk@rice.edu alisiahkoohi.github.io Last updated: July 15, 2024

# **Research Interests and Highlights**

My research in *scientific machine learning* aims to overcome barriers to fully unlocking AI's potential in computational science. I develop scalable, data-driven methods that integrate strengths from both fields to tackle challenging problems in computational science and engineering.

Keywords defining my current research include: computational science, deep learning, generative models, and uncertainty quantification.



Over the past years, I have published 38 peer-reviewed articles, including 17 first-author papers in high-impact journals and conference proceedings, such as NeurIPS, ICML, ICLR, Interspeech, MIDL, SPIE, TMLR, and Geophysics.

# **Academic Appointments**

Rice UniversityAugust 2022 – PresentSimons Postdoctoral FellowHouston, TX, USA

Department of Computational Applied Mathematics & Operations Research Jointly hosted by Maarten V. de Hoop and Richard G. Baraniuk

#### Education

# Georgia Institute of Technology Ph.D. in Computational Science and Engineering (minor in Applied Math.) Advised by Felix J. Herrmann August 2022 Atlanta, GA, USA

University of Tehran March 2016
M.Sc. in Geophysics Tehran, Iran

Sharif University of Technology August 2013
B.Sc. in Electrical Engineering Tehran, Iran

## **Publications**

Google Scholar profile: https://scholar.google.com/citations?user=sxRMqYIAAAAJ&h

#### In Preparation & Under Review

- P5. P. M. Mayer, L. Luzi, <u>A. Siahkoohi</u>, D. H. Johnson, and R. G. Baraniuk. Removing bias from maximum likelihood estimation with model autophagy. Preprint arXiv:2405.13977; under review by *NeurIPS*, 2024
- P4. L. Baldassari, <u>A. Siahkoohi</u>, J. Garnier, K. Sølna, and M. V. de Hoop. Taming score-based diffusion priors for infinite-dimensional nonlinear inverse problems. Preprint arXiv:2405.15676; under review by *NeurIPS*, 2024
- P3. R. Orozco, <u>A. Siahkoohi</u>, M. Louboutin, and F. J. Herrmann. ASPIRE: Iterative amortized posterior inference for Bayesian inverse problems. Preprint arXiv:2405.05398; under review by *Inverse Problems*, 2024

- P2. <u>A. Siahkoohi</u>, R. Morel, R. Balestriero, E. Allys, G. Sainton, T. Kawamura, and M. V. de Hoop. Martian time-series unraveled: A multi-scale nested approach with factorial variational autoencoders. Preprint arXiv:2305.16189, 2024
- P1. R. Orozco, P. Witte, M. Louboutin, <u>A. Siahkoohi</u>, G. Rizzuti, B. Peters, and F. J. Herrmann. InvertibleNetworks.jl: A Julia package for scalable normalizing flows. Preprint arXiv:2312.13480; under review by *Journal of Open Source Software*, 2023

## **Journal Publications**

- J6. L. Luzi, P. M. Mayer, J. Casco-Rodriguez, <u>A. Siahkoohi</u>, and R. G. Baraniuk. Boomerang: Local sampling on image manifolds using diffusion models. *Transactions on Machine Learning Research*, 2024
- J5. M. Louboutin, Z. Yin, R. Orozco, T. J. Grady II, <u>A. Siahkoohi</u>, G. Rizzuti, P. A. Witte, O. Møyner, G. J. Gorman, and F. J. Herrmann. Learned multiphysics inversion with differentiable programming and machine learning. *The Leading Edge*, 42(7):474–486, 2023
- J4. Y. Zhang, Z. Yin, O. López, <u>A. Siahkoohi</u>, M. Louboutin, R. Kumar, and F. J. Herrmann. Optimized time-lapse acquisition design via spectral gap ratio minimization. *Geophysics*, 88(4):A19–A23, 2023
- J3. <u>A. Siahkoohi</u>, G. Rizzuti, R. Orozco, and F. J. Herrmann. Reliable amortized variational inference with physics-based latent distribution correction. *Geophysics*, 88(3):R297–R322, 2023
- J2. <u>A. Siahkoohi</u>, G. Rizzuti, and F. J. Herrmann. Deep Bayesian inference for seismic imaging with tasks. *Geophysics*, 87(5):S281–S302, 2022
- J1. <u>A. Siahkoohi</u>, M. Louboutin, and F. J. Herrmann. The importance of transfer learning in seismic modeling and imaging. *Geophysics*, 84(6):A47–A52, 2019

### **Peer-Reviewed Conference Proceedings**

- C32. S. Alemohammad, J. Casco-Rodriguez, L. Luzi, A. I. Humayun, H. Babaei, D. LeJeune, <u>A. Siahkoohi</u>, and R. G. Baraniuk. Self-consuming generative models go MAD. In *The Twelfth International Conference on Learning Representations*, 2024
- C31. L. Luzi, D. LeJeune, <u>A. Siahkoohi</u>, S. Alemohammad, V. Saragadam, H. Babaei, N. Liu, Z. Wang, and R. G. Baraniuk. Titan: Bringing the deep image prior to implicit representations. In *IEEE International Conference on Acoustics, Speech and Signal Processing*, pages 6165–6169, 2024
- C30. L. Baldassari, <u>A. Siahkoohi</u>, J. Garnier, K. Sølna, and M. V. de Hoop. Conditional score-based diffusion models for Bayesian inference in infinite dimensions. In *Advances in Neural Information Processing Systems*, volume 36, pages 24262–24290, 2023
- C29. <u>A. Siahkoohi</u>, R. Morel, M. V. de Hoop, E. Allys, G. Sainton, and T. Kawamura. Unearthing InSights into Mars: Unsupervised source separation with limited data. In *Proceedings of the 40th International Conference on Machine Learning*, volume 202, pages 31754–31772, 2023
- C28. R. Orozco, M. Louboutin, <u>A. Siahkoohi</u>, G. Rizzuti, T. van Leeuwen, and F. J. Herrmann. Amortized normalizing flows for transcranial ultrasound with uncertainty quantification. In *Medical Imaging with Deep Learning*, volume 227, pages 332–349, 2023
- C27. R. Orozco, <u>A. Siahkoohi</u>, M. Louboutin, and F. J. Herrmann. Refining amortized posterior approximations using gradient-based summary statistics. In *5th Symposium on Advances in Approximate Bayesian Inference*, 2023
- C26. R. Orozco, <u>A. Siahkoohi</u>, G. Rizzuti, T. van Leeuwen, and F. J. Herrmann. Adjoint operators enable fast and amortized machine learning based Bayesian uncertainty quantification. In *Medical Imaging* 2023: *Image Processing*, volume 12464, page 124641L, 2023
- C25. Y. Zhang, Z. Yin, O. Lopez, A. Siahkoohi, M. Louboutin, and F. J. Herrmann. 3D seismic survey design by maximizing the spectral gap. In *Third International Meeting for Applied Geoscience & Energy*, 2023
- C24. <u>A. Siahkoohi</u>, M. Chinen, T. Denton, W. B. Kleijn, and J. Skoglund. Ultra-low-bitrate speech coding with pretrained Transformers. In *Proceedings of Interspeech*, pages 4421–4425, 2022

- C23. <u>A. Siahkoohi</u>, M. Louboutin, and F. J. Herrmann. Velocity continuation with Fourier neural operators for accelerated uncertainty quantification. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 1765–1769, 2022
- C22. M. Louboutin, P. Witte, <u>A. Siahkoohi</u>, G. Rizzuti, Z. Yin, R. Orozco, and F. J. Herrmann. Accelerating innovation with software abstractions for scalable computational geophysics. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 1482–1486, 2022
- C21. Z. Yin, <u>A. Siahkoohi</u>, M. Louboutin, and F. J. Herrmann. Learned coupled inversion for carbon sequestration monitoring and forecasting with Fourier neural operators. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 467–472, 2022
- C20. Y. Zhang, M. Louboutin, <u>A. Siahkoohi</u>, Z. Yin, R. Kumar, and F. J. Herrmann. A simulation-free seismic survey design by maximizing the spectral gap. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 15–20, 2022
- C19. <u>A. Siahkoohi</u>, R. Orozco, G. Rizzuti, and F. J. Herrmann. Wave-equation based inversion with amortized variational Bayesian inference. In *EAGE Deep learning for seismic processing: Investigating the foundations workshop*, 2022
- C18. R. Orozco, <u>A. Siahkoohi</u>, G. Rizzuti, T. van Leeuwen, and F. J. Herrmann. Photoacoustic imaging with conditional priors from normalizing flows. In *NeurIPS Workshop on Deep Learning and Inverse Problems*, 2021
- C17. <u>A. Siahkoohi</u>, G. Rizzuti, M. Louboutin, P. Witte, and F. J. Herrmann. Preconditioned training of normalizing flows for variational inference in inverse problems. In *3rd Symposium on Advances in Approximate Bayesian Inference*, 2021
- C16. <u>A. Siahkoohi</u> and F. J. Herrmann. Learning by example: Fast reliability-aware seismic imaging with normalizing flows. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 1580–1585, 2021
- C15. R. Kumar, M. Kotsi, <u>A. Siahkoohi</u>, and A. Malcolm. Enabling uncertainty quantification for seismic data preprocessing using normalizing flows (NF)—An interpolation example. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 1515–1519, 2021
- C14. G. Rizzuti, <u>A. Siahkoohi</u>, P. A. Witte, and F. J. Herrmann. Parameterizing uncertainty by deep invertible networks, an application to reservoir characterization. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 1541–1545, 2020
- C13. M. Zhang, <u>A. Siahkoohi</u>, and F. J. Herrmann. Transfer learning in large-scale ocean bottom seismic wavefield reconstruction. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 1666–1670, 2020
- C12. <u>A. Siahkoohi</u>, G. Rizzuti, and F. J. Herrmann. Weak deep priors for seismic imaging. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 2998–3002, 2020
- C11. <u>A. Siahkoohi</u>, G. Rizzuti, and F. J. Herrmann. Uncertainty quantification in imaging and automatic horizon tracking—A Bayesian deep-prior based approach. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 1636–1640, 2020
- C10. <u>A. Siahkoohi</u>, G. Rizzuti, and F. J. Herrmann. A deep-learning based Bayesian approach to seismic imaging and uncertainty quantification. In *European Association of Geoscientists & Engineers Conference and Exhibition Extended Abstracts*, 2020
- C9. F. J. Herrmann, <u>A. Siahkoohi</u>, and G. Rizzuti. Learned imaging with constraints and uncertainty quantification. In *NeurIPS Deep Inverse Workshop*, 2019
- C8. <u>A. Siahkoohi</u>, R. Kumar, and F. J. Herrmann. Deep-learning based ocean bottom seismic wavefield recovery. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 2232–2237, 2019
- C7. <u>A. Siahkoohi</u>, D. J. Verschuur, and F. J. Herrmann. Surface-related multiple elimination with deep learning. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 4629–4634, 2019

- C6. G. Rizzuti, <u>A. Siahkoohi</u>, and F. J. Herrmann. Learned iterative solvers for the Helmholtz equation. In *European Association of Geoscientists & Engineers Conference and Exhibition Extended Abstracts*, 2019
- C5. <u>A. Siahkoohi</u>, M. Louboutin, R. Kumar, and F. J. Herrmann. Deep convolutional neural networks in prestack seismic—two exploratory examples. In *Society of Exploration Geophysicists Technical Program Expanded Abstracts*, pages 2196–2200, 2018
- C4. <u>A. Siahkoohi</u>, R. Kumar, and F. J. Herrmann. Seismic data reconstruction with generative adversarial networks. In *European Association of Geoscientists & Engineers Conference and Exhibition Extended Abstracts*, 2018
- C3. <u>A. Siahkoohi</u> and A. Gholami. Sparsity promoting least squares migration for laterally inhomogeneous media. In *7th EAGE Saint Petersburg International Conference and Exhibition*, 2016
- C2. M. S. Ebrahimi, M. H. Daraei, J. Rezaei, and <u>A. Siahkoohi</u>. A novel utilization of wireless sensor networks as data acquisition system in smart grids. In *Materials Science and Information Technology*, volume 433-440, pages 6725–6730, 2012
- C1. A. Najafi, <u>A. Siahkoohi</u>, and M. B. Shamsollahi. A content-based digital image watermarking algorithm robust against JPEG compression. In *IEEE International Symposium on Signal Processing and Information Technology*, pages 432–437, 2011

#### **Theses**

- T2. <u>A. Siahkoohi</u>. *Deep generative models for solving geophysical inverse problems*. PhD thesis, **Georgia Institute of Technology**, 2022
- T1. <u>A. Siahkoohi</u>. *Sparsity promoting least-squares migration for laterally inhomogeneous media*. Master's thesis, University of Tehran, 2016

### **Technical Reports**

- R3. M. Louboutin, <u>A. Siahkoohi</u>, R. Wang, and F. J. Herrmann. Low-memory stochastic backpropagation with multi-channel randomized trace estimation. Technical Report arXiv:2106.06998, Georgia Institute of Technology, 2021
- R2. <u>A. Siahkoohi</u>, G. Rizzuti, P. A. Witte, and F. J. Herrmann. Faster uncertainty quantification for inverse problems with conditional normalizing flows. Technical Report arXiv:2007.07985, Georgia Institute of Technology, 2020
- R1. <u>A. Siahkoohi</u>, M. Louboutin, and F. J. Herrmann. Neural network augmented wave-equation simulation. Technical Report arXiv:1910.00925, Georgia Institute of Technology, 2019

#### **Talks**

#### **Invited Talks**

## T22. CNRS, Université Montpellier

January 2023 Virtual oral presentation

Low-cost uncertainty quantification for large-scale inverse problems RhEoVOLUTION Group (Dr. Andréa Tommasi)

August 2022

T21. Workshop on Subsurface Uncertainty Description and Estimation

Reliable amortized variational inference with conditional normalizing flows via physics-based latent distribution correction

International Meeting for Applied Geoscience & Energy

#### T20. Intelligent illumination of the Earth Workshop

June 2021

October 2020

Fast and reliability-aware seismic imaging with conditional normalizing flows Virtual oral presentation King Abdullah University of Science and Technology

T19. **Advances in Seismic Imaging and Inversion Mini-symposium**Unsupervised data-guided uncertainty analysis in imaging and horizon tracking

Virtual oral presentation

# **Contributed Talks**

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T18.	International Conference on Machine Learning Unearthing InSights into Mars: Unsupervised source separation with limited da	July 2023 ta Poster presentation
T17	Symposium on Advances in Approximate Bayesian Inference	July 2023
117.	Refining amortized posterior approximations using gradient-based summary statistics	Poster presentation
T16.	Geo-Mathematical Imaging Group Partners Meeting, Rice University	May 2023
	Martian time-series unraveled: A multi-scale nested approach with factorial variational autoencoders	Oral presentation
T15.	Geo-Mathematical Imaging Group Partners Meeting, Rice University	May 2023
	Unearthing InSights into Mars: Unsupervised source separation with limited da	ta Oral presentation
T14.	International Meeting for Applied Geoscience & Energy	August 2022
	Velocity continuation with Fourier neural operators for accelerated uncertainty quantification	Oral presentation
T13.	Chrome Media Team, Google	December 2021
	Low-bitrate speech coding with Transformers	Virtual oral presentation
T12.	ML4SEISMIC Partners Meeting, Georgia Institute of Technology	November 2021
	Multifidelity conditional normalizing flows for physics-guided Bayesian inference	Virtual oral presentation
T11.	ML4SEISMIC Partners Meeting, Georgia Institute of Technology	November 2021
		Virtual oral presentation
T10.	Society of Exploration Geophysicists International Exposition and Annual Me	eeting September 2021
		Virtual oral presentation
T9.	Symposium on Advances in Approximate Bayesian Inference	January 2021
		d short oral presentation
T8.	European Association of Geoscientists & Engineers Annual Conference & Exhib	<b>December</b> 2020
	<u>.</u>	Virtual oral presentation
T7.	Society of Exploration Geophysicists International Exposition and Annual Me	eeting October 2020
		Virtual oral presentation
T6.	Society of Exploration Geophysicists International Exposition and Annual Me	eeting October 2020
	Weak deep priors for seismic imaging [Link to video]	
T5.	Society of Exploration Geophysicists Student Chapter, Georgia Tech	February 2020
	A deep-learning based Bayesian approach to seismic imaging and uncertainty quantification	Oral presentation
T4.	HotCSE Seminar, CSE Department, Georgia Institute of Technology	November 2019
	Learned imaging with constraints and uncertainty quantification	Oral presentation
Т3.	Society of Exploration Geophysicists International Exposition & Annual Meet	-
	Deep-learning based ocean bottom seismic wavefield recovery	Oral presentation
T2.	Society of Exploration Geophysicists International Exposition & Annual Meet	_
	Surface-related multiple elimination with deep learning	Oral presentation
11.	Society of Exploration Geophysicists International Exposition & Annual Meet Deep convolutional neural networks in prestack seismic—two exploratory examples	October 2018 Poster presentation

## **Professional Service**

#### **Editorial Service** ► Acta Geophysica 2024 - Present Associate Editor Applied Geophysics section ► Journal of Mathematics 2023 - Present **Guest Editor** Special issue on Applied Mathematics in Inverse Problems and Uncertainty Quantification **Conference Organization** ▶ International Meeting for Applied Geoscience & Energy 2022 Session Chair **Technical Program Committee Member and Reviewer** ► Neural Information Processing Systems (NeurIPS) 2023 - 2024► Advances in Approximate Bayesian Inference (AABI) 2023 - 2024► Structured Probabilistic Inference & Generative Modeling (ICML workshop) 2023 - 2024▶ International Conference on Machine Learning (ICML) 2024 ▶ International Conference on Learning Representations (ICLR) 2024 ► Artificial Intelligence and Statistics Conference (AISTATS) 2024 ► International Speech Communication Association (Interspeech) 2023 ► Deep Generative Models for Health (NeurIPS workshop) 2023 ► International Meeting for Applied Geoscience & Energy 2023 **Journal Reviewer** ▶ IEEE Transactions on Neural Networks and Learning Systems ► IEEE Geoscience and Remote Sensing Letters ▶ IEEE Transactions on Geoscience and Remote Sensing ▶ Notices of the American Mathematical Society (AMS) ► Remote Sensing ▶ Journal of Geophysical Research – Solid Earth ► Geophysical Prospecting ► Geophysics ▶ Geosciences ► Entropy

# **Teaching Experience**

Rice University Instructor for 18 lectures Numerical Analysis I	Fall 2022 Houston, TX, USA
Georgia Institute of Technology Teaching Assistant Computational Foundations of Machine Learning	Spring 2022 Atlanta, GA, USA
Georgia Institute of Technology Teaching Assistant Imaging with Data-Driven Models	Fall 2019 Atlanta, GA, USA

**Georgia Institute of Technology** 

Fall 2018 Teaching Assistant Atlanta, GA, USA

Numerical Analysis I

**Sharif University of Technology** Spring 2011

Teaching Assistant Tehran, Iran Digital Signal Processing

**Sharif University of Technology** Spring 2011 Tehran, Iran

Teaching Assistant Signals and Systems

**Sharif University of Technology** Spring 2010 Teaching Assistant Tehran, Iran

Linear Algebra

Internship

Google August 2021 – December 2021 Research Intern (cf. publication C24) San Francisco, CA, USA

Chrome Media Team