# Ali Siahkoohi

# CURRICULUM VITAE

CONTACT Office Duncan Hall, Room 2037 **Email** alisk@rice.edu INFORMATION 6100 Main Street, Houston, TX 77005 Website alisiahkoohi.github.io RESEARCH My research focuses on generative models, developing scalable methods to overcome computational chal-INTERESTS lenges in the physical and data sciences. Keywords: generative models, deep learning, variational inference, uncertainty quantification ACADEMIC **Simons Postdoctoral Fellow** August 2022 - present Positions Department of Computational Applied Mathematics & Operations Research Rice University, Houston, TX, USA Working jointly with Dr. Maarten V. de Hoop and Dr. Richard G. Baraniuk Georgia Institute of Technology, Atlanta, GA, USA **EDUCATION** August 2022 Ph.D., Computational Science and Engineering University of Tehran, Tehran, Iran March 2016 M.Sc., Geophysics Sharif University of Technology, Tehran, Iran August 2013 B.Sc., *Electrical Engineering* 

#### **PUBLICATIONS**

#### **Preprints**

- P4. 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, 2024
- P3. 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, 2024
- P2. 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, 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, 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. A. Siahkoohi, 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 Papers**

- C32. S. Alemohammad, J. Casco-Rodriguez, L. Luzi, A. I. Humayun, H. Babaei, D. LeJeune, <u>A. Siahkoohi</u>, and R. 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, <u>A. Siahkoohi</u>, 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 *Neural Information Processing Systems 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 *Neural Information Processing Systems 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

T1. <u>A. Siahkoohi</u>. *Deep generative models for solving geophysical inverse problems*. PhD thesis, Georgia Institute of Technology, 2022

# **Technical Reports**

R4. <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. Technical

- Report arXiv:2305.16189, Rice University, 2024
- 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. Low-cost uncertainty quantification for large-scale inverse problems

  January 2023
  - ► RhEoVOLUTION Group (Dr. Andréa Tommasi), CNRS & Université Montpellier
  - ► Virtual oral presentation
- T21. Reliable amortized variational inference with conditional normalizing flows via

  August 2022
  physics-based latent distribution correction
  - ► International Meeting for Applied Geoscience & Energy, Workshop on Subsurface Uncertainty Description and Estimation
  - ► Oral presentation
- T20. Fast and reliability-aware seismic imaging with conditional normalizing flows

June 2021

- ► KAUST Virtual Workshop: Intelligent illumination of the Earth
- ► Virtual oral presentation
- T19. Unsupervised data-guided uncertainty analysis in imaging and horizon tracking

October 2020

- ► The 3rd Annual Meeting of the SIAM Texas-Louisiana Section
- ► Virtual oral presentation

# Contributed talks

T18. Unearthing InSights into Mars: Unsupervised source separation with limited data

July 2023

July 2023

- ► International Conference on Machine Learning
- ► Poster presentation
- T17. Refining amortized posterior approximations using gradient-based summary statistics
  - ► Symposium on Advances in Approximate Bayesian Inference
  - ► Poster presentation
- T16. Martian time-series unraveled: A multi-scale nested approach with factorial variational May 2023 autoencoders
  - ► Geo-Mathematical Imaging Group Partners Meeting, Rice University
  - ▶ Oral presentation
- T15. Unearthing InSights into Mars: Unsupervised source separation with limited data

May 2023

- ► Geo-Mathematical Imaging Group Partners Meeting, Rice University
- ► Oral presentation
- T14. Velocity continuation with Fourier neural operators for accelerated uncertainty quantification

August 2022

- ► International Meeting for Applied Geoscience & Energy
- ▶ Oral presentation
- T13. Low-bitrate speech coding with Transformers

December 2021

- ► Chrome Media Team, Google
- ► Virtual oral presentation
- T12. Multifidelity conditional normalizing flows for physics-guided Bayesian inference November 2021
  - ► ML4SEISMIC Partners Meeting, Georgia Institute of Technology
  - ► Virtual oral presentation

- T11. Uncertainty quantification in imaging and automatic horizon tracking—A Bayesian November 2021 deep-prior based approach
  - ► ML4SEISMIC Partners Meeting, Georgia Institute of Technology
  - ► Virtual oral presentation
- T10. Learning by example: Fast reliability-aware seismic imaging with normalizing

  September 2021

  flows
  - ► Society of Exploration Geophysicists International Exposition and Annual Meeting
  - ► Virtual oral presentation [Link to video]
- T9. Preconditioned training of normalizing flows for variational inference in inverse January 2021 problems
  - ► Symposium on Advances in Approximate Bayesian Inference
  - ► Prerecorded short oral presentation [Link to video]
- T8. A deep-learning based Bayesian approach to seismic imaging and uncertainty quantification December 2020
  - ► European Association of Geoscientists and Engineers Annual Conference & Exhibition
  - ► Virtual oral presentation
- T7. Uncertainty quantification in imaging and automatic horizon tracking—A Bayesian October 2020 deep-prior based approach
  - ► Society of Exploration Geophysicists International Exposition and Annual Meeting
  - ► Virtual oral presentation [Link to video]
- T6. Weak deep priors for seismic imaging

October 2020

- ▶ Society of Exploration Geophysicists International Exposition and Annual Meeting
- ► Virtual oral presentation [Link to video]
- T5. A deep-learning based Bayesian approach to seismic imaging and uncertainty quantification February 2020
  - ► Society of Exploration Geophysicists Student Chapter, Georgia Institute of Technology
  - ► Oral presentation
- T4. Learned imaging with constraints and uncertainty quantification

November 2019

- ► HotCSE Seminar, CSE Department, Georgia Institute of Technology
- ► Oral presentation
- T3. Deep-learning based ocean bottom seismic wavefield recovery

September 2019

- ► Society of Exploration Geophysicists International Exposition and Annual Meeting
- ► Oral presentation
- T2. Surface-related multiple elimination with deep learning

September 2019

October 2018

- ▶ Society of Exploration Geophysicists International Exposition and Annual Meeting
- ► Oral presentation
- T1. Deep convolutional neural networks in prestack seismic—two exploratory examples
  - ► Society of Exploration Geophysicists International Exposition and Annual Meeting
  - ► Poster presentation

# PROFESSIONAL SERVICE

#### **Editorial Service**

Special issue on Applied Mathematics in Inverse Problems and Uncertainty Quantification

- ▶ Journal of Mathematics, 2023
- ▶ Guest Editor

## **Conference Organization**

- ▶ Organizer, Deep Learning and Inverse Problems Workshop (NeurIPS 2024)
- ▶ Session Chair, International Meeting for Applied Geoscience & Energy (IMAGE 2022)

## 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

## **Technical Program Committee Member and Reviewer**

- ► Neural Information Processing Systems (NeurIPS 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)
- ► Advances in Approximate Bayesian Inference (AABI 2023–2024)
- ► Structured Probabilistic Inference & Generative Modeling (ICML workshop, 2023–2024)
- ► Deep Generative Models for Health (NeurIPS workshop, 2023)
- ► International Meeting for Applied Geoscience & Energy (IMAGE 2023)

TEACHING EXPERIENCE

# **Numerical Analysis I**

Fall 2022

Rice University, Houston, TX, USA

Instructor for 18 lectures

## **Computational Foundations of Machine Learning**

Spring 2022

Georgia Institute of Technology, Atlanta, GA, USA

**Teaching Assistant** 

# **Imaging with Data-Driven Models**

Fall 2019

Georgia Institute of Technology, Atlanta, GA, USA

**Teaching Assistant** 

## Numerical Analysis I

Fall 2018

Georgia Institute of Technology, Atlanta, GA, USA

**Teaching Assistant** 

# **Digital Signal Processing**

Spring 2011

Sharif University of Technology, Tehran, Iran

**Teaching Assistant** 

# Signals and Systems

Spring 2011

Sharif University of Technology, Tehran, Iran

Teaching Assistant

# Linear Algebra

Spring 2010

Sharif University of Technology, Tehran, Iran

Teaching Assistant

INTERNSHIP

#### **Research Intern**

August 2021 – December 2021

Chrome Media Team

Google, San Francisco, CA, USA