# Lianrui Zuo | Curriculum Vitae

#### PROFESSIONAL EXPERIENCE

Postdoctoral Research Fellow, Vanderbilt University

Medical-image Analysis and Statistical Interpretation (MASI) Laboratory

Advisor: Dr. Bennett Landman

Predoctoral Research Fellow, National Institute on Aging, NIH

Laboratory of Behavioral Neuroscience

Advisor: Dr. Susan M. Resnick

Graduate Research Assistant, Johns Hopkins University

Image Analysis and Communications Laboratory (IACL)

Advisor: Dr. Jerry L. Prince

Nashville, United States

Mar 2024 – Present

**Baltimore**, United States

Sep 2019 – Sep 2023

**Baltimore**, United States

Sep 2017 – Jan 2024

Jul 2018 – Jan 2024

#### **EDUCATION**

#### **Johns Hopkins University**

Ph.D. in Electrical and Computer Engineering

Thesis: "Unsupervised structural MRI harmonization by learning disentangled representations."

Johns Hopkins University

**Baltimore, United States** 

**Baltimore**, United States

M.S.E. in Electrical and Computer Engineering

Aug 2016 – May 2018

Thesis: "Quality assurance using outlier detection for cerebellar lobule segmentation."

Jilin University Changchun, China

*B.S. in Instrumentation Science and Technology* Distinctive undergraduate with top 3% GPA

Sep 2012 – May 2016

#### **HONORS & AWARDS**

Bold font indicates sole award recipient or as first author.

#### 2019 - 2023

• **Predoctoral Intramural Research Training Award.** Fellowship number: NIH89367. *National Institutes of Health.* 

#### 2023

- Best Poster Award. "(First author) Inconsistent MR acquisition in longitudinal volumetric analysis: impacts and solutions." Americas Committee for Treatment and Research in Multiple Sclerosis (ACTRIMS) Young Scientist Summit, 2023.
- Best Paper Award. "(Third author) Self-supervised super-resolution for anisotropic MR images with and without slice gap." The 8th Workshop in Simulation and Synthesis in Medical Imaging (SASHIMI) in conjunction with MICCAI 2023.
- (Finalist) Siebel Scholarship 2024. Siebel Scholars Foundation.

- Young Scientist Summit Training Award. Americas Committee for Treatment and Research in Multiple Sclerosis (ACTRIMS), 2023.
- (Nomination) Best Platform in Multiple Sclerosis Research Award. Consortium of Multiple Sclerosis Centers (CMSC) Annual Meeting, 2023.

#### 2022

• **Best Paper Award.** "(First author) Disentangling a single MR modality." *The Second Workshop on Data Augmentation, Labeling, and Imperfections (DALI) in conjunction with MICCAI 2022.* 

#### 2021

• **Best Poster Award.** "(First author) Information-based disentangled representation learning for unsupervised MR harmonization." *The 27th Conference on Information Processing in Medical Imaging (IPMI)*, 2021.

#### 2020

- Best Paper Award. "(Second author) Variational intensity cross channel encoder for unsupervised vessel segmentation on OCT angiography." In Medical Imaging: International Society for Optics and Photonics (SPIE), 2020.
- **Scientific Director Award.** The 25th Annual National Institute on Aging Intramural Research Program Scientific Retreat, 2020.

#### 2019

• (Finalist) Excellence in Teaching Award. Whiting School of Engineering, Johns Hopkins University.

#### 2013 - 2016

o Outstanding Student Award. Jilin University.

# **MEDIA COVERAGE & INVITED TALKS**

#### Media coverage.....

- Interviewed by *NeurologyLive* on novel harmonization approaches for multiple scelrosis care. June 2023. Available at https://www.neurologylive.com/conferences/cmsc.
- Interviewed by *Video Journal of Neurology* about how image harmonization can help with multicohort MS trials. June 2023. Available at https://vjneurology.com/speaker/lianrui-zuo/.

#### Invited talks

- "From voxels to patients: A data-centric journey towards consistent translational AI." December 2023. Host: Dr. Bennett Landman, Department of Electrical and Computer Engineering, Vanderbilt University.
- "Unsupervised MR image harmonization with disentangled representation learning." August 2023 (virtual). Host: Dr. Yogesh Rathi, Brigham and Women's Hospital, Harvard Medical School.
- "Unsupervised MR harmonization with disentanglement." November 2022 (virtual). Host: Dr. Kevin S. Zhou, University of Science and Technology of China.
- "Domain shift, domain adaptation, and magnetic resonance image harmonization." October 2022.
  At CS 600.475 Machine Learning. Host: Dr. Mark Dredze, Johns Hopkins University.

- "An overview of disentangled representation learning for MR harmonization." September 2022.
  At Neural Systems Analysis Laboratory. Host: Dr. Arachana Venkataraman, Johns Hopkins University.
- "Unsupervised MR image harmonization using disentangled representation learning." August 2021 (virtual). At Computational Neuroimage Science Laboratory. Host: Dr. Kilian Pohl, Stanford University.

# **MENTORING & TEACHING**

#### Mentoring.....

#### **Graduate Independent Study**

#### Johns Hopkins University

Research mentor

Spring 2023

Investigated using deep learning based deformable image registration to achieve medical image synthesis. A full-length conference paper [C4] is accepted at SPIE 2024 as a long oral presentation, journal version is currently in preparation.

#### **Graduate Independent Study**

Johns Hopkins University

Research mentor

Fall 2022

Investigated using disentangled harmonization to identify optimal operating contrasts for different segmentation algorithms. Published two conference papers [C7-C8] and a conference abstract [A6].

#### **Undergraduate Independent Study**

Johns Hopkins University

Research mentor

Spring 2022

Investigated the impact of harmonization on longitudinal volumetric analysis.

#### **Research Experiences for Undergraduates**

**National Science Foundation** 

Research mentor

Summer 2021

Published a full-length conference paper [C20] as a research mentor.

## Teaching.....

## EN 520.414/520.614 Image Processing and Analysis I

Johns Hopkins University

Teaching Assistant

Fall 2017, Fall 2018

Instructor: Dr. John Goutsias

#### EN 520.433/520.623 Medical Image Analysis

**Johns Hopkins University** 

Teaching Assistant

Spring 2018, Spring 2021

Instructor: Dr. Jerry L. Prince

**COMMUNITY SERVICES** 

# Organizer.....

- **Chair.** The 9th Workshop on Simulation and Synthesis in Medical Imaging (SASHIMI), in conjunction with MICCAI 2024.
- **Editorial Chair.** The 3rd International Workshop on Data Augmentation, Labeling, and Imperfections (DALI), in conjunction with MICCAI 2023

# Journal Reviewer

- Artificial Intelligence in Medicine
- Biomedical Signal Processing and Control

- Computers and Electrical Engineering
- Computers in Biology and Medicine
- Computer Methods and Programs in Biomedicine
- IEEE Transactions on Big Data
- IEEE Transactions on Medical Imaging
- Journal of Imaging Informatics in Medicine
- Pattern Recognition
- Multimedia Systems
- Medical Image Analysis

#### Conference Reviewer.....

- International Conference on Medical Image Computing and Computer-Assisted Intervention (MICCAI).
- International Workshop on Data Augmentation, Labeling, and Imperfections (DALI) in conjunction with MICCAI.

#### **BOOK CHAPTERS**

- B1. **L. Zuo**, Y. Liu, J. L. Prince, and A. Carass. "An overview of disentangled representation learning for MR image harmonization." *Deep Learning for Medical Image Analysis (Second Edition)*, editors: S. K. Zhou, H. Greenspan, and D. Shen, December 2023.
- B2. Y. Liu, L. Zuo, Y. He, S. Han, J. Lei, J. L. Prince, and A. Carass. "OCTA segmentation with limited training data using disentangled representation learning." *Deep Learning for Medical Image Analysis* (*Second Edition*), editors: S. K. Zhou, H. Greenspan, and D. Shen, December 2023.
- B3. B. E. Dewey, Y. He, Y. Liu, **L. Zuo**, and J. L. Prince. "Medical image harmonization through synthesis." *Biomedical Image Synthesis and Simulation: Methods and Applications (First Edition)*, edited by N. Burgos and D. Svoboda, June 2022.

# **JOURNAL PUBLICATIONS**

- J1. (Under revision) Y. Liu, J. Chen, **L. Zuo**, Y. Du, A. Carass, and J. L. Prince. "Vector field attention for deformable image registration" *IEEE Transactions on Medical Imaging* (2023).
- J2. L. Zuo, Y. Liu, Y. Xue, B. E. Dewey, S. W. Remedios, S. P. Hays, M. Bilgel, E. M. Mowry, S. D. Newsome, P. A. Calabresi, S. M. Resnick, J. L. Prince, and A. Carass. "HACA3: A unified approach for multi-site MR image harmonization". Computerized Medical Imaging and Graphics (2023). Software available at: https://github.com/lianruizuo/haca3
- J3. Y. Liu, A. Carass, **L. Zuo**, Y. He, S. Han, L. Gregori, S. Murray, R. Mishra, J. Lei, P. A. Calabresi, S. Saidha and J. L. Prince. "Disentangled representation learning for OCTA vessel segmentation with limited training data." *IEEE Transactions on Medical Imaging* (2022), 41(12), pp.3686-3698.

- J4. **L. Zuo**, B. E. Dewey, Y. Liu, Y. He, S. D. Newsome, E. M. Mowry, S. M. Resnick, J. L. Prince, and A. Carass. "Unsupervised MR harmonization by learning disentangled representations using information bottleneck theory." *NeuroImage* (2021), 243, p.118569.
- J5. Y. He, A. Carass, **L. Zuo**, B. E. Dewey, and J. L. Prince. "Autoencoder based self-supervised test-time adaptation for medical image analysis." *Medical Image Analysis* (2021), 72, p.102136.

# **FULL-LENGTH CONFERENCE PUBLICATIONS**

- C1. (Accepted) J. Zhang, **L. Zuo**, B. E. Dewey, S. W. Remedios, D. L. Pham, A. Carass, and J. L. Prince. "Towards an accurate and generalizable multiple sclerosis lesion segmentation model using self-ensembled lesion fusion." *International Symposium on Biomedical Imaging (ISBI)*, 2024.
- C2. (Accepted) Y. Wang, Y. Liu, S. Wei, Y. Xue, **L. Zuo**, S. W. Remedios, Z. Bian, M. Meggyesy, J. Ahn, R. Lee, M. G. Luciano, J. L. Prince, and A. Carass. "Deep Learning-Based Segmentation of Hydrocephalus Brain Ventricle from Ultrasound." *International Society of Optics and Photonics (SPIE)*, 2024.
- C3. (Accepted) J. Zhang, L. Zuo, B. E. Dewey, S. W. Remedios, S. P. Hays, D. L. Pham, J. L. Prince, and A. Carass. "Harmonization-enriched domain adaptation with light fine-tuning for multiple sclerosis lesion segmentation." *International Society of Optics and Photonics (SPIE)*, 2024.
- C4. (Accepted) S. P. Hays, **L. Zuo**, Y. Liu, J. Zhuo, J. L. Prince, and A. Carass. "Revisiting registration-based synthesis: A focus on unsupervised MR image synthesis" *International Society of Optics and Photonics (SPIE)*, 2024. **Long oral presentation**
- C5. S. W. Remedios, S. Han, **L. Zuo**, A. Carass, D. Pham, J. L. Prince, and B. E. Dewey. "Self-supervised super-resolution for anisotropic MR images with and without slice gap." *The 8th Workshop in Simulation and Synthesis in Medical Imaging (SASHIMI) in conjunction with International Conference on Medical Image Computing and Computer Assisted Intervention (MICCAI) 2023. Oral presentation. Best Paper Award.*
- C6. S. Wei, Y. Liu, Z. Bian, Y. Wang, **L. Zuo**, P. A. Calabresi, S. Saidha, J. L. Prince, and A. Carass. "Recurrent self fusion: Iterative denoising for consistent retinal OCT segmentation." *The 10th Ophthalmic Medical Image Analysis Workshop (OMIA) in conjunction with International Conference on Medical Image Computing and Computer Assisted Intervention (MICCAI), vol 14096, pp. 42–51, 2023.*
- C7. S. P. Hays, **L. Zuo**, Y. Wang, M. G. Luciano, A. Carass, and J. L. Prince. "Exploring the optimal operating MR contrast for brain ventricle parcellation." *Medical Imaging with Deep Learning (MIDL)*, Nashville, TN, July 10–12, 2023.
- C8. S. P. Hays, **L. Zuo**, Y. Wang, M. G. Luciano, A. Carass, and J. L. Prince. "Exploring the optimal operating MR contrast for brain ventricle parcellation." *International Symposium on Biomedical Imaging (ISBI)*, 2023.
- C9. P. Duan, Y. Xue, S. Han, **L. Zuo**, A. Carass, C. Bernhard, P. A. Calabresi, S. M. Resnick, J. S. Duncan, and J L. Prince. "Rapid brain meninges surface reconstruction with layer topology guarantee" *International Symposium on Biomedical Imaging (ISBI)*, 2023. **Oral Presentation.**

- C10. Y. Wang, A. Feng, Y. Xue, **L. Zuo**, Y. Liu, M. G. Luciano, A. Carass, and J. L. Prince. "Automated ventricle parcellation and Evan's ratio computation in pre- and post-surgical ventriculomegaly." *International Symposium on Biomedical Imaging (ISBI)* 2023.
- C11. **L. Zuo**, Y. Xue, B. E. Dewey, Y. Liu, J. L. Prince, and A. Carass. "A latent space for unsupervised MR image quality control via artifact assessment." *Medical Imaging* 2023: *Image Processing*, vol. 12464. *International Society of Optics and Photonics* (SPIE), 2023. **Oral Presentation.**
- C12. A. Hong, A. Carass, **L. Zuo**, J. L. Prince, A. Alshareef. "Investigating the effect of cerebral atrophy on brain deformation using subject-specific models." *Medical Imaging* 2023: *Biomedical Applications in Molecular, Structural, and Functional Imaging, vol.* 12468. *International Society of Optics and Photonics (SPIE)*, 2023. **Oral Presentation.**
- C13. Y. Xue, **L. Zuo**, S. W. Remedios, B. E. Dewey, P. Duan, Y. Liu, R. Zhang, S. D. Newsome, E. M. Mowry, A. Carass, and J. L. Prince. "Unsupervised quality assurance for brain MR image rigid registration using latent shape representation." *Medical Imaging* 2023: *Image Processing*, vol. 12464. *International Society of Optics and Photonics* (SPIE), 2023.
- C14. P. Tohidi, S. Han, **L. Zuo**, J. Zhuo, S. R. Roys, A. Carass, R. Gullapalli, and J. L. Prince. "Joint synthesis of WMn MPRAGE and parameter maps using deep learning and an imaging equation." *Medical Imaging* 2023: *Image Processing. Vol.* 12464. *International Society of Optics and Photonics (SPIE)*, 2023.
- C15. **L. Zuo**, Y. Liu, Y. Xue, S. Han, M. Bilgel, S. M. Resnick, J. L. Prince, and A. Carass. "Disentangling a single MR modality." *Second Workshop in Data Augmentation, Labeling, and Imperfections (DALI)* 2022, held in conjunction with International Conference on Medical Image Computing and Computer Assisted Intervention (MICCAI), pp. 54–63. Singapore, 2022. **Best Paper Award.**
- C16. Y. Xue, B. E. Dewey, **L. Zuo**, S. Han, A. Carass, P. Duan, S. W. Remedios, D. L. Pham, S. Saidha, P. A. Calabresi, J. L. Prince. "Bi-directional synthesis of pre- and post-contrast MRI via guided feature disentanglement." *The 7th Workshop in Simulation and Synthesis in Medical Imaging (SASHIMI)* 2022, held in conjunction with International Conference on Medical Image Computing and Computer Assisted Intervention (MICCAI), pp. 55-65. Singapore, 2022. **Oral Presentation.**
- C17. Y. Liu, **L. Zuo**, S. Han, J. L. Prince, and A. Carass. "Coordinate translator for learning deformable medical image registration." *Third Workshop in Multiscale Multimodal Medical Imaging (MMMI)* 2022, held in conjunction with International Conference on Medical Image Computing and Computer Assisted Intervention (MICCAI), pp. 98-109. Singapore, 2022. **Oral Presentation.**
- C18. M. Shao, **L. Zuo**, A. Carass, J. Zhuo, R. P. Gullapalli, J. L. Prince. "Evaluating the impact of MR image harmonization on thalamus deep network segmentation." *In Medical Imaging* 2022: *Image Processing*, vol. 12032, pp. 115-121. *International Society of Optics and Photonics* (SPIE), 2022. **Oral Presentation.**
- C19. P. Duan, S. Han, **L. Zuo**, Y. An, Y. Liu, A. Alshareef, J. Lee, A. Carass, S. M. Resnick, J. L. Prince. "Cranial meninges reconstruction based on convolutional networks and deformable models: applications to longitudinal study of normal aging." *In Medical Imaging* 2022: *Image Processing*, vol. 12032, pp. 1203215-1. *International Society of Optics and Photonics* (SPIE), 2022. **Oral Presentation**.
- C20. S. P. Hays, **L. Zuo**, A. Carass, and J. L. Prince. "Evaluating the impact of MR image contrast on whole brain segmentation." *In Medical Imaging* 2022: *Image Processing*, vol. 12032, pp. 122-126. *International Society of Optics and Photonics* (SPIE), 2022. **Oral Presentation.**

- C21. **L. Zuo**, B. E. Dewey, A. Carass, Y. Liu, Y. He, P. A. Calabresi, and J. L. Prince. "Information-based disentangled representation learning for unsupervised MR harmonization." *In International Conference on Information Processing in Medical Imaging (IPMI)* 2021, pp. 346-359. **Best Poster Award.**
- C22. **L. Zuo**, B. E. Dewey, A. Carass, Y. He, M. Shao, J. C. Reinhold, and J. L. Prince. "Synthesizing realistic brain MR images with noise control." *Fifth Workshop in Simulation and Synthesis in Medical Imaging (SASHIMI)*, held in conjunction with the International Conference on Medical Image Computing and Computer Assisted Intervention (MICCAI) 2020, pp. 21-31. **Oral Presentation.**
- C23. B. E. Dewey, L. Zuo, A. Carass, Y. He, Y. Liu, E. M. Mowry, S.D. Newsome, J. Oh, P. A. Calabresi, and J. L. Prince. "A disentangled latent space for cross-Site MRI harmonization." *In International Conference on Medical Image Computing and Computer-Assisted Intervention (MICCAI)* 2020, pp. 720-729. Oral Presentation.
- C24. Y. He, A. Carass, **L. Zuo**, B. E. Dewey, and J. L. Prince. "Self domain adapted network." *In International Conference on Medical Image Computing and Computer-Assisted Intervention (MICCAI)* 2020, pp. 437-446. **Oral Presentation.**
- C25. Y. Liu, **L. Zuo**, A. Carass, Y. He, A. Filippatou, S. D. Solomon, S. Saidha, P. A. Calabresi, and J. L. Prince. "Variational intensity cross channel encoder for unsupervised vessel segmentation on OCT angiography." *In Medical Imaging 2020: Image Processing, vol. 11313, p. 113130Y. International Society of Optics and Photonics (SPIE), 2020.* **Best Paper Award.**
- C26. **L. Zuo**, S. Han, A. Carass, S. H. Ying, C. U. Onyike, and J. L. Prince. "Automatic quality control using hierarchical shape analysis for cerebellum parcellation." *In Medical Imaging 2019: Image Processing, vol. 10949*, p. 109490J. International Society of Optics and Photonics (SPIE), 2019. **Oral Presentation.**
- C27. **L. Zuo**, A. Carass, S. Han, and J. L. Prince. "Automatic outlier detection using hidden Markov model for cerebellar lobule segmentation." *In Medical Imaging 2018: Biomedical Applications in Molecular, Structural, and Functional Imaging, vol. 10578, p. 105780D. International Society of Optics and Photonics (SPIE), 2018. Oral Presentation.*

## **CONFERENCE ABSTRACTS**

- A1. L. Zuo, S. P. Hays, B. E. Dewey, S. W. Remedios, Y. Xue, S. D. Cassard, C. Koch, A. Fishman, A. Carass, J. L. Prince, E. M. Mowry, and S. D. Newsome. "Inconsistent MR acquisition in longitudinal volumetric analysis: impacts and solutions." *Consortium of Multiple Sclerosis Centers* (*CMSC*) *Annual Meeting*, Aurora, CO, May 31–June 3, 2023. Best Platform in Multiple Sclerosis Research Award (Nomination).
  - Presentation available at: https://github.com/lianruizuo/inconsistent\_acquisition
- A2. S. Wei, Y. Liu, **L. Zuo**, S. Saidha, P. A. Calabresi, J. L. Prince, and A. Carass. "Retinal layer thickness comparison between the UK BioBank and people with multiple sclerosis." *Consortium of Multiple Sclerosis Centers* (*CMSC*) *Annual Meeting*, Aurora, CO, May 31–June 3, 2023.
- A3. Y. Xue, B. E. Dewey, L. Zuo, S. W. Remedios, S. P. Hays, S. D. Cassard, C. Koch, A. Fishman, A. Carass, P. A. Calabresi, Jerry L. Prince, E. M. Mowry, and S. D. Newsome. "Synthesizing

- missing MRI sequences to improve processing images in multiple sclerosis." *Consortium of Multiple Sclerosis Centers (CMSC) Annual Meeting*, Aurora, CO, May 31–June 3, 2023.
- A4. B. E. Dewey, A. Fishman, S. D. Cassard, L. Zuo, S. W. Remedios, Y. Xue, C. Koch, A. Carass, J. L. Prince, E. M. Mowry, and S. D. Newsome. "Measuring MRIs Differences Between Sites: Design of a Traveling Subject Study in MS." Consortium of Multiple Sclerosis Centers (CMSC) Annual Meeting, Aurora, CO, May 31–June 3, 2023.
- A5. B. E. Dewey, **L. Zuo**, S. W. Remedios, Y. Xue, S. D. Cassard, C. Koch, A. Fishman, A. Carass, J. L. Prince, E. M. Mowry, and S. D. Newsome. "Compliance with CMSC MRI guidelines in a multi-center, pragmatic, randomized clinical trial: Improvements over time." *Consortium of Multiple Sclerosis Centers* (CMSC) *Annual Meeting*, Aurora, CO, May 31–June 3, 2023.
- A6. S. P. Hays, **L. Zuo**, B. E. Dewey, S. W. Remedios, Y. Xue, S. D. Cassard, C. Koch, A. Fishman, A. Carass, P. A. Calabresi, J. L. Prince, E. M. Mowry, and S. D. Newsome. "Quantifying contrast differences among MR images used in clinical studies." *Consortium of Multiple Sclerosis Centers* (*CMSC*) *Annual Meeting*, Aurora, CO, May 31–June 3, 2023.
- A7. S. W. Remedios, B. E. Dewey, Y. Xue, **L. Zuo**, S. D. Cassard, C. Koch, A. Fishman, A. Carass, J. L. Prince, E. M. Mowry, and S. D. Newsome. "Cautions in anisotropy: Thick slices and slice gaps in 2D MR acquisition tarnish volumetrics." *Consortium of Multiple Sclerosis Centers (CMSC) Annual Meeting*, Aurora, CO, May 31–June 3, 2023.
- A8. B. E. Dewey, S. D. Cassard, A. Fishman, **L. Zuo**, Y. He, A. Carass, J. L. Prince, E. M. Mowry, and S. D. Newsome. "Improving the utilization of standardized MRIs in multiple sclerosis care: A pragmatic trial perspective" *Consortium of Multiple Sclerosis Centers (CMSC) Annual Meeting*, Orlando, FL, Oct 25–28, 2021. **Oral Presentation.**