Heitor R. Guimarães

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Research Interests

Machine Learning: Self-supervised learning, robustness against adversarial and OOD data, model compression *Speech Processing*: Speech representation learning, keyword spotting, speech recognition, speech enhancement

Education

Institut National de la Recherche Scientifique (INRS)

Montreal, CA

2022 - 2026

Ph.D. Telecommunications Advisor: Dr. Tiago H. Falk

Research Interests: Self-Supervised Learning; Model Compression; Domain Adaptation

University of São Paulo (USP)

São Paulo, BR 2021 – 2022

M.Sc. Electrical Engineering

Advisor: Dr. Miguel Arjona Ramírez, Dr. Wesley Beccaro

Thesis: On Self-Supervised Representations for 3D Speech Enhancement

Aeronautics Institute of Technology (ITA)

São Paulo, BR

2018 - 2018

2013 - 2018

Data Science Specialization

Advisor: Dr. Hitoshi Nagano

Thesis: Monaural Speech Enhancement through Deep Wave-U-Net

Federal University of Rio de Janeiro (UFRJ)

Rio de Janeiro, BR

Computer and Information Engineering

Advisor: Dr. Ricardo Guerra Marroquim

Senior Project: *Music Information Retrieval*: *A deep learning approach*.

Work Experience

Itaú-Unibanco São Paulo, SP

Senior Data Scientist

Jun 2018 – May 2022

Itaú-Unibanco is the largest private bank in Latin America. I worked in a department called Business Incubator, responsible for pushing forward the analytical environment of the company.

- Developed a wide range of classical ML models, from conception to deployment, for the credit card business, impacting more than 20MM users and achieving over US\$ 60MM in revenue.
- Implemented a tool based on contextual embeddings to understand the client's necessities on chat and commercial Whatsapp with his account managers to direct business actions.
- Guided business analyst to become Data Scientist through in-company talks and lectures.

General Electric

Global Research Center (GRC), Rio de Janeiro

Aug 2015 – Aug 2017

Research Data Scientist Intern

- Conception and Implementation of algorithms, written in Python, for asset location in indoor environments (factories, buildings, etc.)
- Developed tools for anomaly detection in Python and R to understand the behavior of a Blowout Preventer (BOP) and analyze the pump efficiency on Petroleum extraction using Machine Learning

CBPF (Brazilian Center for Research in Physics)

Urca, Rio de Janeiro Jun 2013 – Aug 2015

Research Assistant (Undergraduate)

- Implemented the Kozeny–Carman method to estimate permeability through computer vision. Compared to commercial software, our tool improved the time performance by 36 times, costing an acceptable 9% relative error.
- Recipient of a Scholarship from the Foundation for Supporting the Development of Scientific Computing

Publications

- (i) Heitor R. Guimarães, Arthur Pimentel, Anderson Avila, and Tiago Falk. "VIC-KD: Variance-Invariance-Covariance Knowledge Distillation to Make Keyword Spotting More Robust Against Adversarial Attacks."
 Under review. Submitted to IEEE International Conference on Acoustics, Speech, & Signal Processing (ICASSP) (2024). [Link]
- (ii) **Heitor R. Guimarães**, Arthur Pimentel, Anderson Avila, Mehdi Rezagholizadeh, Boxing Chen, and Tiago Falk. "An Efficient End-to-End Approach to Noise Invariant Speech Features via Multi-Task Learning." Under review. Submitted to IEEE Transactions on Audio, Speech, and Language Processing (2023).
- (iii) Wesley Beccaro, Miguel Arjona Ramírez, William Liaw, and **Heitor R. Guimarães**. "Analysis of Oral Exams with Speaker Diarization and Speech Emotion Recognition: A Case Study." IEEE Transactions on Education (2023).
- (iv) **Heitor R. Guimarães***, Mahsa Abdollahi*, Yi Zhu, Ségolène Maucourt, Nico Coallier, Pierre Giovenazzo, and Tiago H. Falk. "Adapting Self-Supervised Features for Background Speech Detection in Beehive Audio Recordings." IEEE International Workshop on Metrology for Agriculture and Forestry (2023).
- (v) Yi Zhu, Mahsa Abdollahi, Ségolène Maucourt, Nico Coallier, **Heitor R. Guimarães**, Pierre Giovenazzo, and Tiago H. Falk. "Early prediction of honeybee hive winter survivability using multi-modal sensor data." IEEE International Workshop on Metrology for Agriculture and Forestry (2023).
- (vi) **Heitor R. Guimarães**, Yi Zhu, Orson Mengara, Anderson R. Avila, and Tiago H. Falk. "Assessing the Vulnerability of Self-Supervised Speech Representations for Keyword Spotting Under White-Box Adversarial Attacks." IEEE International Conference on Systems, Man, and Cybernetics (SMC) (2023).
- (vii) **Heitor R. Guimarães**, Arthur Pimentel, Anderson Avila, Mehdi Rezagholizadeh, Boxing Chen, and Tiago Falk. "RobustDistiller: Compressing Universal Speech Representations for Enhanced Environment Robustness." IEEE International Conference on Acoustics, Speech, & Signal Processing (ICASSP) (2023). [Link]
- (viii) **Heitor R. Guimarães**, Arthur Pimentel, Anderson Avila, Mehdi Rezagholizadeh, and Tiago Falk. "Improving the Robustness of DistilHuBERT to Unseen Noisy Conditions via Data Augmentation, Curriculum Learning, and Multi-Task Enhancement". Efficient Natural Language and Speech Processing (ENLSP-II) Workshop NeurIPS (2022). [Link]
- (ix) **Heitor R. Guimarães**, Arthur Pimentel, Anderson Avila, Mehdi Rezagholizadeh, and Tiago Falk. "An Exploration into the Performance of Unsupervised Cross-Task Speech Representations for *In the Wild* Edge Applications". Abstract. Edge Intelligence Workshop (2022). [Link]
- (x) Arthur Pimentel, **Heitor R. Guimarães**, Anderson Avila, Mehdi Rezagholizadeh, and Tiago Falk. "How Robust is *Robust wav2vec 2.0* for Edge Applications? An Exploration into the Effects of Quantization and Model Pruning on *In the Wild* Speech Recognition". Abstract. Edge Intelligence Workshop (2022). [Link]
- (xi) **Heitor R. Guimarães**, Wesley Beccaro, and Miguel A. Ramirez. "A PERCEPTUAL LOSS BASED COMPLEX NEURAL BEAMFORMING FOR AMBIX 3D SPEECH ENHANCEMENT." Proc. L3DAS22: Machine Learning for 3D Audio Signal Processing: 16-20 (2022). [Link]
- (xii) **Heitor R. Guimarães**, Wesley Beccaro, and Miguel A. Ramírez. "Optimizing Time Domain Fully Convolutional Networks for 3D Speech Enhancement in a Reverberant Environment Using Perceptual Losses." 2021 IEEE 31st International Workshop on Machine Learning for Signal Processing (MLSP). (2021). [Link]
- (xiii) **Heitor R. Guimarães**, Hitoshi Nagano, and Diego W. Silva. "Monaural speech enhancement through deep Wave-U-Net." Expert Systems with Applications 158 (2020): 113582. [Link]
- (xiv) Luciana Dias , Clecio Bom, **Heitor R. Guimarães**, Elisângela Faria, Marcio Albuquerque, Marcelo Albuquerque, Maury Correia, and Rodrigo Surmas. "Segmentation of Microtomography images of rocks using texture filter." Notas Técnicas. 6. 19-27 (2016). DOI 10.7437/NT2236-7640/2016.01.003. [Link]

Workshops, Presentations, and Talks

- (i) "RobustDistiller: Compressing Universal Speech Representations for Enhanced Environment Robustness". Poster Presentation. IEEE ICASSP (2023).
- (ii) "Improving the Robustness of DistilHuBERT to Unseen Noisy Conditions via Data Augmentation, Curriculum Learning, and Multi-Task Enhancement". Oral Presentation (**Spotlight**). Efficient Natural Language and Speech Processing (ENLSP-II) workshop NeurIPS (2022). [Link]
- (iii) "An Exploration into the Performance of Unsupervised Cross-Task Speech Representations for *In the Wild* Edge Applications". Poster Presentation. Edge Intelligence Workshop (2022).
- (iv) "Optimizing Time Domain Fully Convolutional Networks for 3D Speech Enhancement in a Reverberant Environment Using Perceptual Losses." Oral Presentation. IEEE 31st International Workshop on Machine Learning for Signal Processing (MLSP). (2021).
- (v) Porosity and Absolute Permeability estimation through Image Processing. Oral Presentation. "XXII undergraduate research fair of the Brazilian Center for Research in Physics (2015)".

Honors & Awards

- IEEE Signal Processing Society (SPS) Scholarship 2023
- CIFAR Inclusive AI Scholarship 2023
- Travel Grant from TD Assurance to attend the ICASSP 2023
- Finalist, spotlight oral presentation (top 8 out of 70+ papers) at the ENLSP Workshop at NeurIPS 2022
- Scholarship for International Students INRS 2022
- 2nd place in the L3DAS Challenge, Task 1 (Speech Enhancement) 2021
- Scholarship from the Foundation for Supporting the Development of Scientific Computing 2013 2015

Additional Information

Journal Reviewer Expert Systems with Applications, IEEE TASLP

Conference Reviewer IEEE MLSP 2023, IEEE SMC 2023, IEEE ICASSP 2023, IEEE MLSP 2021

Invited Talk

- Self-Supervised Learning for Speech Applications. *Minds Digital*. (2023).
- On the usage of Neural Networks for Speech Enhancement. Itaú Data Science Meetup. (2022).

Teaching Experience

- Lecturer at Ada Bootcamp Deep Learning. 2020 2022.
- Teaching Assistant at UFRJ Undergraduate course EEL890 Big data. 2016.

Mentorship Experience

- Professional Master's 2023 Co-supervised a student on adversarial attacks for speech emotion recognition.
- MUSAE Summer Internship 2023 Co-supervising one student on audio-based deep-fake detection.

Relevant Coursework & Summer Schools

- CIFAR Deep Learning + Reinforcement Learning (DLRL) Summer School 2023
- Speech Communications (TEL250 INRS / ECSE523 McGill, A) 2023
- Representation Learning (IFT6135 Mila, A) 2022
- Adversarial Attacks (TEL351 INRS, A+) 2022

Diversity and Inclusion Member of the Black in AI (BAI) affinity group

Extracurricular activity Member of the Formula SAE - Responsible for the implementation of a telemetry system and data analysis of a small formula-style car. Our team achieved 5^{th} place in the 2015 competition.

Language: English (C1), French (A1), and Portuguese (Native)