

# Raphaël Olivier

I am a PhD candidate at CMU working with prof. Bhiksha Raj on Robust Speech Representations, Neural ASR, Secure and Trustworthy Machine Learning and Adversarial threats and defenses.

## Education

- 2019–  
Ongoing **Carnegie Mellon University**,  
*Ph.D in Language Technologies*, Language Technologies Institute  
Thesis on the security and robustness of Speech representations, advised by prof. Bhiksha Raj
- 2017–2019 **Carnegie Mellon University**,  
*M.S. in Language Technologies*, Language Technologies Institute  
GPA 4.0
- 2014–2017 **École Polytechnique of Paris**,  
*Applied Mathematics and Computer Science*, Ingénieur Polytechnicien Program  
This program is the most selective Science and Technology degree in France, with core courses in Mathematics, Sciences and Humanities
- 2012–2014 **Classes Préparatoires**,  
*Math, Physics and Computer Science*, Lycée Pasteur
- Two years of intensive training for nationwide entrance exams to French Grandes Écoles
  - Ranked 1<sup>st</sup>/40 all two years
  - Ranked 30<sup>th</sup> to 60<sup>th</sup> nationwide at 4 competitive entrance exams

## Experience

- June-Aug  
2021 **Applied Scientist Intern**, AMAZON ALEXA, Pittsburgh, PA  
I evaluated the Alexa Speech Recognition models against data poisoning attacks and found ways to make them more robust
- June-Aug  
2020 **Applied Scientist Intern**, AMAZON ALEXA, Pittsburgh, PA  
I worked on privacy and membership inference attacks and defenses on Speech Recognition models
- Apr-Aug  
2017 **Research Intern**, AGROPARISTECH, Paris, France  
Research project on Transfer Learning for time series using boosting methods, advised by prof. Antoine Cornuejols.  
The work was presented at the Symposium on Intelligent Data Analysis
- June-Aug  
2016 **Data Scientist Intern**, DATASCIENTEST, Paris, France  
Participated in the creation of DataSciencTest, which grew up to become a leading online training platform for Data Scientists. I designed the first generation of Machine Learning exercises and automatic evaluation code.

## Talks

- Nov 2022 **Invited research talk**, Technion University, Haifa, Israel
- Aug 2022 **Invited research talk**, Security and Privacy for Speech Communication (SPSC) group, online
- Sep 2019 **Tutorial**, InterSpeech conference, Graz, Austria  
With Prof. Bhiksha Raj and Joseph Keshet, I gave a tutorial on generating adversarial examples for speech and speaker recognition
- Sep 2018–  
May 2022 **Introduction to Deep Learning**, Prof. Bhiksha Raj, Guest Lecturer
- I gave several guest lectures for this 200+ students course at Carnegie Mellon University
  - I covered topics like Deep Learning History, GANs, Transformers and GNNs
  - Previously, I was twice a Teaching Assistant with tasks including Recitations, Homework design and grading, Office Hours and Project mentoring.

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## Highlighted Projects

- Mar 2022–  
Ongoing **Attacks and Defenses for Self-Supervised Speech Representations**
- I studied the vulnerabilities of modern Transformer ASR models pretrained with Self-Supervised Learning (Wav2Vec2, WavLM, Data2Vec, etc).
  - I show that learning features from a very general pretext training task makes these models more at risk to black-box threat models. Work under review **[Paper][Code]**.
  - Currently, I am trying to turn this vulnerability into an asset, by augmenting SSL pretraining with adversarial examples to improve robustness and model transferability.
- Sep 2022–  
Ongoing **Indirect impacts of adversarial vulnerabilities for ASR security**
- Releasing non-robust ASR models has indirect consequences that can be more problematic than the adversarial examples themselves. We study several in our recent research direction.
  - We apply *data poisoning* to insert a backdoor in ASR models trained with semi-supervised learning, using targeted adversarial perturbations to fool the teacher during pseudo-labeling. Project in collaboration with Shinji Watanabe's research group.
  - We use *membership inference* to predict whether the speaker of a given utterance is in the training data of a model. Our method relies on adversarial perturbations to probe the shape of the local decision boundary.
  - We fooled Whisper, a *multilingual* ASR model, to mispredict the language of a sentence. This degrades recognition performance with a very low perturbation budget. Work under review **[Paper][Code]**.
- Jan 2020–  
Dec 2022 **Adversarial defenses for Speech and audio with Smoothing and Speech Processing**
- As part of the GARD Darpa project, I defended Speech Recognition and Audio classification models against adversarial attacks, by combining the Gaussian Smoothing defense with traditional Speech Processing methods.
  - First I applied high-frequency filters to the smoothing gaussian noise, to better target adversarial patterns in the High frequency spectrum. Work published at *ICASSP 2021* **[Paper]**
  - Then I combined it Speech Enhancement methods and Ttext voting schemes to improve its performance on CTC and Attention models. Work published at *EMNLP 2021* **[Paper][Code]**
  - More recently I replaced the enhancement module with a Denoising Diffusion model, applied it to Wav2Vec2 and considerably improved our previous defense. Work scheduled for submission at InterSpeech 2023.
- Sep 2021–Sep  
2022 **robust\_speech: a Speech Robustness package**
- I released a package for evaluating the robustness of ASR models. This package and our results were presented at InterSpeech 2022 **[Paper][Code]**
  - robust\_speech is currently used by several industry research teams worldwide. I keep maintaining it and releasing new features.
- Jan  
2021–Dec  
2021 **Evaluating robustness beyond adversarial accuracy**
- Using accuracy for evaluating adversarial robustness has limits. We outline them and propose to instead approximate the amount of adversarial perturbations, using angle-based metrics as a proxy. **[Paper][Code]**
- Jan 2018 -  
Nov 2018 **Retrieval-based neural code generation, with Prof. Graham Neubig**
- We trained a Code generation encoder-decoder model, with a decoder constrained by the syntax tree and using subtree retrieval in the training set at inference to improve performance.
  - Our project was the 2018 State-of-the Art on two coding tasks and was presented at EMNLP 2018 **[Paper][Code]**

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## Skills

- Languages Python, C/C++, Java, SQL, Bash
- Frameworks PyTorch, Tensorflow, DyNet, Fairseq, SpeechBrain
- Utilities Anaconda, Git, Jupyter Notebook, Alexa Skills, AWS

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## Courses

- Machine Learning Natural Language Processing, Deep Learning, Advanced Machine Learning, Multimodal Machine Learning, Neural Language Translation
- CS Algorithms, Advanced Programming, Data Management, Computational Geometry
- Math Logic, Algebra, Number Theory, Analysis, Optimization, Differential Equations, Sequences/Series