## NATANIEL RUIZ

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#### **EDUCATION**

Ph.D. Candidate, Boston University, Boston, MA GPA: 3.95 / 4.0 (expected) 2018 - 2022

Ph.D. Candidate in Computer Science

Advisor: Prof. Stan Sclaroff

Research Group: Image and Video Computing

M.Sc., Georgia Institute of Technology, Atlanta, GA GPA: 3.90 / 4.0 2016 - 2017

M.Sc. in Computer Science Advisor: Prof. James M. Rehg Research Group: Behavioral Imaging

**B.Sc. / M.Sc., Ecole Polytechnique,** Paris, France Graduate GPA: 3.86 / 4.0 2013 - 2016

N°1 Ranked French Grande Ecole in Science and Technology Bachelor of Science & Master of Science in Data Science

Lycée Jean-Baptiste Say, Paris, France GPA: 3.80 / 4.0 2011 – 2013

N°1 Ranked Program in Physics, Technology and Industrial Science.

2-year intensive preparation in Mathematics and Physics for the nationwide Grande Ecole entrance examinations.

Admitted to Ecole Polytechnique (0.6% acceptance rate).

#### **AWARDS**

## Twitch Research Fellowship Finalist (2020), Twitch

Second Round for the Open Phil AI Fellowship (2020), Open Philanthropy

DeepMind Travel Award (2020), Conference on Computer Vision and Pattern Recognition (CVPR)

Travel Award (2019), International Conference on Learning Representations (ICLR)

Distinguished Presenter and Brilliant Award (2019), 4th Annual Boston University Data Science Day

Dean's Fellowship (2018-2019), Boston University

Outstanding Leadership Award (2016, 2% award rate), Ecole Polytechnique

Excellence-Major Valedictorian Scholarship (2011-2016), French Government

### **PUBLICATIONS**

#### [Paper, In Submission]

**Nataniel Ruiz**, Adam Kortylewski, Weichao Qiu, Cihang Xie, Sarah Adel Bargal, Alan Yuille\*, Stan Sclaroff\*. "Simulated Adversarial Testing of Face Recognition Models" *Under Review for Conference* (2021)

## [Paper, ICML Workshop 2021]

Benjamin Spetter-Goldstein, **Nataniel Ruiz**, Sarah Adel Bargal. "Examining the Human Perceptibility of Black-Box Adversarial Attacks on Face Recognition" *ICML Adversarial Machine Learning Workshop* (2021)

#### [Paper, In Submission]

**Nataniel Ruiz**, Barry-John Theobald, Anurag Ranjan, Ahmed Hussein Abdelaziz, Nicholas Apostoloff. "MorphGAN: One-Shot Face Synthesis GAN for Detecting Recognition Bias" *Under Review for Conference* (2021)

## [Paper, ICLR Workshop 2021 and In Submission]

Nataniel Ruiz, Sarah Adel Bargal, Stan Sclaroff. "Protecting Against Image Translation Deepfakes by Leaking Universal Perturbations from Black-Box Neural Networks" *ICLR Security and Safety in Machine Learning Systems Workshop* (2021) and *Under Review for Conference* (2021)

## [Paper, FG 2021]

Nataniel Ruiz, Mona Jalal, Vitaly Ablavsky, Danielle Allessio, John Magee, Jacob Whitehill, Ivon Arroyo, Beverly Woolf, Stan Sclaroff, and Margrit Betke. "Leveraging Affect Transfer Learning for Behavior Prediction in an Intelligent Tutoring System" *IEEE International Conference on Automatic Face and Gesture Recognition 2021 (FG 2021)* 

### [Paper, ECCV Workshop 2020]

**Nataniel Ruiz**, Sarah Adel Bargal, Stan Sclaroff. "Disrupting DeepFakes: Adversarial Attacks Against Conditional Image Translation Networks and Facial Manipulation Systems" *CVPR 2020 Workshop on Adversarial Machine Learning in Computer Vision* (2020) **(Oral)** and published at *European Conference on Computer Vision (ECCV) Workshop* (2020)

### [Paper, CVPR 2020]

Eunji Chong, Yongxin Wang, **Nataniel Ruiz**, James M. Rehg. "Detecting Attended Visual Targets in Video" *The IEEE Conference on Computer Vision and Pattern Recognition (CVPR)* (2020)

## [Paper, ICLR 2019]

Nataniel Ruiz, Samuel Schulter, Manmohan Chandraker. "Learning To Simulate" *International Conference on Learning Representations* (ICLR) (2019)

### [Paper, ECCV 2018]

Eunji Chong, **Nataniel Ruiz**, Yongxin Wang, Yun Zhang, Agata Rozga, James M. Rehg. "Connecting Gaze, Scene, and Attention: Generalized Attention Estimation via Joint Modeling of Gaze and Scene Saliency." *The European Conference on Computer Vision (ECCV)*, (2018), pp. 383-398

## [Paper, Arxiv 2018]

Meera Hahn, **Nataniel Ruiz**, Jean-Baptiste Alayrac, Ivan Laptev, James M Rehg. "Learning to Localize and Align Fine-Grained Actions to Sparse Instructions." *arXiv preprint arXiv:1809.08381* (2018)

## [Paper, CVPRW 2018]

**Nataniel Ruiz**, Eunji Chong, and James M. Rehg. "Fine-Grained Head Pose Estimation Without Keypoints." In *Proceedings of the IEEE Conference on Computer Vision and Pattern Recognition Workshops*, pp. 2074-2083. (2018) **(Oral)** 

## [Paper, UBICOMP 2017, IMWUT 2017]

Eunji Chong, Katha Chanda, Zhefan Ye, Audrey Southerland, **Nataniel Ruiz**, Rebecca M. Jones, Agata Rozga, and James M. Rehg. "Detecting Gaze Towards Eyes in Natural Social Interactions and Its Use in Child Assessment." *Proceedings of the ACM on Interactive, Mobile, Wearable and Ubiquitous Technologies* 1, no. 3 (2017): 43 (Oral and Distinguished Paper Award - 3% award rate)

## [Paper, Arxiv 2017]

**Nataniel Ruiz**, and James M. Rehg. "Dockerface: an Easy to Install and use Faster R-CNN Face Detector in a Docker Container." *arXiv* preprint arXiv:1708.04370 (2017)

#### **PATENTS**

Theobald, Barry-John, Nataniel Ruiz, and Nicholas Apostoloff. Patent approved for Apple project, waiting for permission to disclose. Schulter, Samuel, Nataniel Ruiz, and Manmohan Chandraker. "Learning to simulate." U.S. Patent Application No. 16/696,087.

#### **PRESENTATIONS**

# **Invited Talks**

Aug 2021	Amazon Softlines Research Presentation, research presentation

- Jun 2021 Max Planck Institute for Intelligent Systems, Perceiving Systems (Prof. Michael Black lab), seminar
- Sep 2020 Johns Hopkins University, Department of Computer Science (Prof. Alan Yuille lab), seminar
- Sep 2020 University of Massachusetts at Amherst, College of Computer Science (Prof. Beverly Woolf class), guest lecture
- Aug 2020 Apple Inc., Senior Director of AI and Machine Learning (Prof. Carlos Guestrin), research presentation
- Mar 2020 Boston University, Department of Computer Science, AI Research Lab, seminar

Feb	2020	Massachusetts Institute of Technology, CSAIL, Vision and Graphics Group (Prof. Antonio Torralba lab), seminar	
Nov	2019	Georgia Institute of Technology, School of Interactive Computing (Prof. James M. Rehg lab), seminar	
Oct	2019	University of Massachusetts at Amherst, College of Computer Science (Prof. Beverly Woolf class), guest lecture	
Sep	2019	Apple Inc., Machine Learning Vice President (Dr. John Giannandrea), research presentation	
Aug	2019	Apple Inc., Siri, research presentation	
Aug	2019	Apple Inc., AI Research, research presentation	
Feb	2019	Boston University, Department of Computer Science, AI Research Lab, seminar	
Feb	2019	Boston University Data Science Day, distinguished presenter	
Jan	2019	Boston University, AI Research Lab Retreat, invited presentation	
Jan	2019	KPMG, Bolivia, machine learning seminar	
Aug	2018	NEC Laboratories America Inc., research presentation	
Contributed Talks			
		ICLR, Security and Safety in Machine Learning Systems Workshop, oral presentation	
•		ECCV, Advances in Image Manipulation Workshop, oral presentation	
		CVPR, Workshop on Adversarial Machine Learning in Computer Vision, oral presentation	
Dec	2019	New England Computer Vision Workshop (NECV), Brown University, oral presentation	
Sep	2019	Machine Intelligence Conference (MIC), Boston University, oral presentation	
Jun	2018	CVPR, Automatic Face and Gesture Recognition Workshop, oral presentation	
Posters			
May	2021	ICLR, Security and Safety in Machine Learning Systems Workshop	
Aug	2020	ECCV, Advances in Image Manipulation Workshop	
Jun	2020	CVPR, Workshop on Adversarial Machine Learning in Computer Vision	
Dec	2019	New England Computer Vision Workshop (NECV), Brown University	
May	2019	International Conference on Learning Representations (ICLR)	
Feb	2019	Boston University Data Science Day	

### RESEARCH EXPERIENCE

Jun 2018 CVPR, Automatic Face and Gesture Recognition Workshop

Amazon, New York City, NY

Jun 2021 - Present

Research Intern

• Working with Dr. Javier Romero, Dr. Timo Bolkart and Dr. Raja Bala on computer vision, simulation and machine learning.

## Apple AI Research, Cupertino, CA

Jun 2020 - Aug 2020

Research Assistant Intern

• Worked with **Dr. Nick Apostoloff** and **Dr. Barry Theobald** on a one-shot face synthesis GAN for detecting recognition bias.

# Apple AI Research, Cupertino, CA

May 2019 - Aug 2019

Research Assistant Intern

• Worked with **Dr. Nick Apostoloff** and **Dr. Barry Theobald** on a one-shot face synthesis GAN for detecting recognition bias.

# Boston University, Boston, MA

Sep 2018 - Present

Research Fellow

• Working with **Prof. Stan Sclaroff**, **Prof. Margrit Betke**, **Dr. Sarah Adel Bargal** on topics related to facial analysis, image translation, adversarial attacks, simulation and behavior understanding.

Research Assistant Intern

• Worked with **Prof. Manmohan Chandraker** and **Dr. Samuel Schulter** on topics related to self-driving car perception, visual data simulation and reinforcement learning. One paper accepted to ICLR on the topic of learning to simulate.

## Georgia Institute of Technology, Atlanta, GA

Dec 2016 – Dec 2017

Graduate Research Assistant

- Worked with **Prof. James Rehg** on facial analysis, behavior understanding, first person vision and mobile computer vision.
- Co-authored four papers, one tech-report and released three open-source computer vision applications in 2017 while taking a full-time course load.

## Massachusetts Institute of Technology, Cambridge, MA

May 2016 - Aug 2016

Visiting Research Assistant (funding: Bill and Melinda Gates Foundation Grant)

• Worked with **Dr. Lalana Kagal** and **Dr. Kalyan Veeramachaneni** building a deep learning application on Android for visual detection of diseases in cassava plant leaves. Deployed the application on the field in Kampala, Uganda.

#### REVIEWER

International Conference on Machine Learning (ICML) 2021

Conference on Computer Vision and Pattern Recognition (CVPR) 2021, 2018

International Conference on Learning Representations (ICLR) 2020

Conference on Neural Information Processing Systems (NeurIPS) 2020

International Conference on Computer Vision (ICCV) 2021, 2019

Transactions on Pattern Analysis and Machine Intelligence (TPAMI) 2020, 2019

Winter Conference on Applications of Computer Vision (WACV) 2021, 2020

Asian Conference on Computer Vision (ACCV) 2020

ICLR Workshop on Security and Safety in Machine Learning Systems 2021

ECCV Adversarial Robustness in the Real World Workshop 2020

ECCV Advances in Image Manipulation Workshop 2020

Pattern Recognition 2020

Transactions on Neural Networks and Learning Systems (TNNLS) 2020, 2019, 2018

Transactions on Cybernetics 2018

### **SELECTED PROJECTS**

2,000+ stars on original machine learning GitHub repositories at github.com/natanielruiz

Disrupting Deepfakes: Adversarial Attacks on Conditional Image Translation Networks

• Adversarial attacks on image translation systems to prevent modification of a person's images

## Deep Learning Head Pose Estimation

• Head pose estimation deep neural network bundled with pre-trained models.

### Android-YOLO

• Open source real-time object detection deep learning system on an Android device.

### Dockerface

• Open source deep learning face detection in a Docker container.

### **EGTEA Gaze+ Dataset**

• Co-lead the annotation of a large open-access egocentric vision action recognition dataset.

## Udacity Lecture

• Authored an online lecture for Prof. James M. Rehg on Facial Landmark Detection to be released by Georgia Tech on the Udacity platform.

### Learning to Simulate in Medium

- 18,000+ visits
- Front page on Y Combinator's Hacker News
- Front page on Towards Data Science

### **Disrupting Deepfakes**

- TWIML AI Podcast interview
- Mentioned on Forbes
- Front page on Boston University's The Brink
- Front page on Y Combinator's <u>Hacker News</u>
- Front page on Reddit /r/machinelearning subreddit

#### **LEADERSHIP & AFFILIATIONS**

## TEDxEcolePolytechnique, Ecole Polytechnique

2014 - 2016

President and founder

- Founded and organized the first TEDx conference at Ecole Polytechnique.
- Recruited and managed the 2015 and 2016 student teams.

## Entrepreneurship Student Society, Ecole Polytechnique

2014 - 2016

Speaker & Startup Relations Manager

- Organized the first Startup Showcase and job fair at Polytechnique.
- Obtained the participation of over ten startups for the Startup Showcase.
- Obtained the participation of entrepreneur coaches and a panel of senior entrepreneur judges for the Startup Weekend event.

### SELECTED GRADUATE COURSEWORK

### **Boston University**

Deep Learning (CS 591), Advanced Optimization Algorithms (CS 531)

## Georgia Institute of Technology

Machine Learning (CS 7641), Computer Vision (CS 6476), Advanced Computer Vision (CS 7476), Natural Language (CS 7650), Data and Visual Analytics (CS 6476), Knowledge Based AI (CS 7637)

### **Ecole Polytechnique**

Statistical Learning and Non-Parametric Estimation (MAP 553), Machine Learning (INF 582), Operations Research (MAP 557)

### RESEARCH MENTORSHIP

Benjamin Spetter-Goldstein (B.S. in C.S., 2021, Boston University) - work on perceptibility of black-box adversarial attacks Yongxin Wang (B.S. in C.S., 2017, Georgia Tech) - now M.Sc. student, Computer Vision at Carnegie Mellon University Vaishali Sarathy (M.Sc. in C.S., 2017, Georgia Tech) - now at Schlumberger

## SKILLS AND LANGUAGES

Python, C++, Java, Matlab – PyTorch, pytorch3d, TensorFlow, scikit-learn – GNU/Linux, bash – SQL – some Android, HTML, PHP. Fluent in English, French and Spanish.

### LINKS AND REFERENCES

All papers, pre-prints and code can be found at <u>natanielruiz.github.io</u>