# Hrayr Harutyunyan

☑ harhro@gmail.com, hrayrhar@usc.edu ♦ ♦ hrayrhar.github.io ♦ □ 213-561-7995

#### **EDUCATION**

#### University of Southern California

PhD in Computer Science

Advisors: Aram Galstyan and Greg Ver Steeg

Coursework:

· CSCI 670: Advanced analysis of algorithms, Fall 2018

· EE 546: Mathematics of high-dimensional data, Fall 2018

· DSO 699: Statistical learning theory, Spring 2018

· CSCI 699: Advanced topics in deep learning, Spring 2018

· CSCI 699: Theoretical machine learning, Fall 2019

· CSCI 699: Topics in Discrete Optimization and Learning, Fall 2020

Teaching assistantship:

· CSCI 670: Advanced analysis of algorithms, Fall 2019

· CSCI 270: Introduction to Algorithms and Theory of Computing, Spring 2020

Research assistantship:

· Global analysis of weak signals for enterprise event detection, Fall 2018 to Fall 2019

· Learning with less labels, Spring 2020 to Fall 2022

Yerevan State University

MSc in Discrete Mathematics and Theoretical Informatics

Thesis: Extension of linear CorEx for time series

Advisor: Anahit Chubaryan

Yerevan State University

BSc in Computer Science and Applied Mathematics

Thesis: Spoken language identification with deep learning

Advisor: Armen Andreasyan

**EXPERIENCE** 

Google Research

May 2022 - Aug. 2022, Sept. 2022 - Oct. 2022

Research Intern, Student Researcher

New York, NY, USA

Sept. 2016 - June 2018

Sept. 2012 - June 2016

GPA: 19.9/20

GPA: 19.6/20

Aug. 2018 - present

Current GPA: 4.0

Project: Supervision complexity and its role in knowledge distillation

· Introducing a new theoretical perspective on knowledge distillation through a measure of alignment between the teacher-provided supervision and the student's neural tangent kernel.

Amazon.com, Inc

May 2021 - Aug. 2021

Applied Scientist Intern

Remote

Project: Test error prediction and analysis via sample information measures

- · Estimating the number of samples needed to reach a certain level of performance in a supervised learning task
- · Finding which sub-populations of examples should be sampled more in order to achieve the goal efficiently

Amazon.com, Inc

May 2020 - Aug. 2020

Remote

Applied Scientist Intern

Project: Information content of samples

· Defining and estimating the unique information content of samples in supervised learning tasks

#### YerevaNN Research Lab

June 2016 - July 2018

Yerevan, Armenia

Machine Learning Researcher

- · Establishing benchmarks for clinical prediction tasks
- · Automated question answering using deep learning
- · Representation learning with generative models

#### **USC Information Sciences Institute**

June 2017 - Sept. 2017

Marina Del Rey, CA, USA

Machine Learning Researcher, Intern

- · Learning disentangled representations via synergy minimization
- · Temporal covariance estimation using non-overlapping Gaussian latent factor models

#### RESEARCH INTERESTS

My main research direction is studying information stored in neural network weights or activations, and its connections to generalization, memorization, stability and learning dynamics. More broadly, I am interested in learning theory, generalization under domain shifts, unsupervised/self-supervised representation learning, and in the generalization phenomenon of deep neural networks.

#### PUBLICATIONS AND PREPRINTS

- A. Jain, G. Swaminathan, P. Favaro, H. Yang, A. Ravichandran, H. Harutyunyan,
   A. Achille, O. Dabeer, B. Schiele.
   A Meta-Learning Approach to Predicting Performance and Data Requirements.
   CVPR, 2023
- [2] **H. Harutyunyan**, A.S. Rawat, A.K. Menon, S. Kim, S. Kumar. Supervision Complexity and its Role in Knowledge Distillation. *ICLR*, 2023
- [3] **H. Harutyunyan**, GV. Steeg, A. Galstyan. Formal limitations of sample-wise information-theoretic generalization bounds. *IEEE Information Theory Workshop*, 2022
- [4] T. Galstyan, H. Harutyunyan, H. Khachatrian, GV. Steeg, A. Galstyan. Failure Modes of Domain Generalization Algorithms. CVPR, 2022
- [5] KSM. Hossain, H. Harutyunyan, Y. Ning, B. Kennedy, N. Ramakrishnan, A. Galstyan. Identifying Geopolitical Event Precursors using Attention-based LSTMs. Frontiers in Artificial Intelligence, 2022
- [6] H. Harutyunyan, M. Raginsky, GV. Steeg, A. Galstyan. Information-theoretic generalization bounds for black-box learning algorithms. NeurIPS, 2021
- [7] **H. Harutyunyan**, A. Achille, G. Paolini, O. Majumder, A. Ravichandran, R. Bhotika, S. Soatto. Estimating informativeness of samples with Smooth Unique Information. *ICLR*, 2021
- [8] H. Harutyunyan, K. Reing, GV. Steeg, A. Galstyan. Improving Generalization by Controlling Label-Noise Information in Neural Network Weights. ICML, 2020

- [9] GV. Steeg, **H. Harutyunyan**, D. Moyer, A. Galstyan. Fast structure learning with modular regularization. NeurIPS, 2019
- [10] H. Harutyunyan, H. Khachatrian, DC. Kale, GV. Steeg, A. Galstyan. Multitask learning and benchmarking with clinical time series data. Nature Scientific Data, 2019.
- [11] **H. Harutyunyan**, D. Moyer, H. Khachatrian, GV. Steeg, A. Galstyan Efficient covariance estimation from temporal data. arXiv:1905.13276, 2019
- [12] S. Abu-El-Haija, B. Perozzi, A. Kapoor, N. Alipourfard, K. Lerman, H. Harutyunyan, GV. Steeg, A. Galstyan. MixHop: higher-order graph convolutional architectures via sparsified neighborhood mixing. ICML, 2019
- [13] GV. Steeg, R. Brekelmans, **H. Harutyunyan**, A. Galstyan.
  Disentangled representations via synergy minimization.

  Allerton Conference on Communication, Control, and Computing (Allerton), 2017.

Python, C/C++

#### **SKILLS**

Programming Languages

USC Annenberg Graduate Fellow  ACM ICPC World Finals, Finalist  Google HashCode, Finalist  Russian Code Cup, Finalist  Yerevan State University Gold Medal For outstanding results in programming competitions  ACM ICPC Northeastern European Regional Contest First Diploma, 17th place Second Diploma, 33th place Champion of Armenia Champion of Southern Caucasus  Open Southern Caucasus Championship, First Diploma Independence Cup of Armenia, First Place  International Olympiad in Informatics, Bronze medal National Olympiads in Physics, Mathematics and Informatics		, ,	
WARDS, HONORS AND ACHIEVEMENTS  KAUST Rising Stars in AI Symposium, Speaker  USC Annenberg Graduate Fellow  ACM ICPC World Finals, Finalist  Google HashCode, Finalist  Russian Code Cup, Finalist  2017, 2018  Russian Code Cup, Finalist  2016  Yerevan State University Gold Medal For outstanding results in programming competitions  ACM ICPC Northeastern European Regional Contest First Diploma, 17th place Second Diploma, 33th place Champion of Armenia Champion of Southern Caucasus  Open Southern Caucasus Championship, First Diploma  Independence Cup of Armenia, First Place International Olympiad in Informatics, Bronze medal National Olympiads in Physics, Mathematics and Informatics	Software & Tools	tware & Tools PyTorch, Tensorflow, Keras, MATLAB, Wolfram Mathematica	
KAUST Rising Stars in AI Symposium, Speaker 2023 USC Annenberg Graduate Fellow 2018 ACM ICPC World Finals, Finalist 2017 Google HashCode, Finalist 2017, 2018 Russian Code Cup, Finalist 2016 Yerevan State University Gold Medal 2016 For outstanding results in programming competitions ACM ICPC Northeastern European Regional Contest First Diploma, 17th place 2015 Second Diploma, 17th place 2015 Champion of Armenia 2013 - 2016 Champion of Southern Caucasus 2015, 2016 Open Southern Caucasus Championship, First Diploma 2013 - 2016 Independence Cup of Armenia, First Place 2013 - 2017 International Olympiad in Informatics, Bronze medal 2012 National Olympiads in Physics, Mathematics and Informatics	Languages	English, Armenian (native), Russian	
USC Annenberg Graduate Fellow  ACM ICPC World Finals, Finalist  Google HashCode, Finalist  Russian Code Cup, Finalist  Yerevan State University Gold Medal For outstanding results in programming competitions  ACM ICPC Northeastern European Regional Contest First Diploma, 17th place Second Diploma, 33th place Champion of Armenia Champion of Southern Caucasus  Open Southern Caucasus Championship, First Diploma Independence Cup of Armenia, First Place  International Olympiad in Informatics, Bronze medal National Olympiads in Physics, Mathematics and Informatics	AWARDS, HONORS AND	ACHIEVEMENTS	
ACM ICPC World Finals, Finalist  Google HashCode, Finalist  Russian Code Cup, Finalist  2017, 2018  Russian Code Cup, Finalist  2016  Yerevan State University Gold Medal For outstanding results in programming competitions  ACM ICPC Northeastern European Regional Contest First Diploma, 17th place Second Diploma, 33th place Champion of Armenia Champion of Southern Caucasus  Open Southern Caucasus Championship, First Diploma  Independence Cup of Armenia, First Place  International Olympiad in Informatics, Bronze medal  National Olympiads in Physics, Mathematics and Informatics	KAUST Rising Stars in AI Symposium, Speaker		2023
Google HashCode, Finalist  Russian Code Cup, Finalist  Yerevan State University Gold Medal For outstanding results in programming competitions  ACM ICPC Northeastern European Regional Contest First Diploma, 17th place Second Diploma, 33th place Champion of Armenia Champion of Southern Caucasus  Open Southern Caucasus Championship, First Diploma Independence Cup of Armenia, First Place  National Olympiads in Physics, Mathematics and Informatics	USC Annenberg Graduate Fellow		2018
Russian Code Cup, Finalist  Yerevan State University Gold Medal For outstanding results in programming competitions  ACM ICPC Northeastern European Regional Contest First Diploma, 17th place Second Diploma, 33th place Champion of Armenia Champion of Southern Caucasus  Open Southern Caucasus Championship, First Diploma Independence Cup of Armenia, First Place  National Olympiads in Physics, Mathematics and Informatics	ACM ICPC World Finals, Finalist		2017
Yerevan State University Gold Medal For outstanding results in programming competitions  ACM ICPC Northeastern European Regional Contest  First Diploma, 17th place 2016 Second Diploma, 33th place 2015 Champion of Armenia 2013 - 2016 Champion of Southern Caucasus 2015, 2016 Open Southern Caucasus Championship, First Diploma 2013 - 2016 Independence Cup of Armenia, First Place 2013 - 2017 International Olympiad in Informatics, Bronze medal 2012 National Olympiads in Physics, Mathematics and Informatics	Google HashCode, Finalist		2017, 2018
For outstanding results in programming competitions  ACM ICPC Northeastern European Regional Contest  First Diploma, 17th place 2016 Second Diploma, 33th place 2015 Champion of Armenia 2013 - 2016 Champion of Southern Caucasus 2015, 2016 Champion of Southern Caucasus Championship, First Diploma 2013 - 2016 Independence Cup of Armenia, First Place 2013 - 2017 International Olympiad in Informatics, Bronze medal 2012 National Olympiads in Physics, Mathematics and Informatics	Russian Code Cup, Finalist		2016
First Diploma, 17th place Second Diploma, 33th place Champion of Armenia Champion of Southern Caucasus Open Southern Caucasus Championship, First Diploma Independence Cup of Armenia, First Place International Olympiad in Informatics, Bronze medal National Olympiads in Physics, Mathematics and Informatics	· · · · · · · · · · · · · · · · · · ·		2016
Independence Cup of Armenia, First Place  2013 - 2017  International Olympiad in Informatics, Bronze medal  National Olympiads in Physics, Mathematics and Informatics	First Diploma, 17th place Second Diploma, 33th place Champion of Armenia		2016 2015 2013 - 2016 2015, 2016
International Olympiad in Informatics, Bronze medal  National Olympiads in Physics, Mathematics and Informatics	Open Southern Caucasus Championship, First Diploma		2013 - 2016
National Olympiads in Physics, Mathematics and Informatics	Independence Cup of Armenia, First Place		2013 - 2017
• •	International Olympiad in Informatics, Bronze medal		2012
	<b>0 1</b>	• ,	2008 - 2012

## Conference Reviewing

NeurIPS'20, ICML'21, NeurIPS'21, ICLR'21, ICML'22, ICLR'23

## ACM ICPC Trainings at USC

Fall 2018

Lecturer

## Weekly Machine Learning Seminars

Sept. 2017 - July 2018

 ${\it Co-organizer}$ 

Presented and discussed recent advances in machine learning.

## National Olympiad in Informatics

2013 - 2018

 $Committee\ member$ 

Prepared tasks for the national Olympiad in informatics.

Trained students for international Olympiad in informatics.

## **International Olympiad in Informatics**

2016

Deputy leader of Armenian national team

Trained students for the competition.

## **INTERESTS**

Reading, art house, billiards, skiing, chess, music, philosophy.