# Vahe Gharakhanyan

**└** (510) 333-6330 | ☑ vg2471@columbia.edu | **☆** gvahe.github.io | **۞** gvahe | **in** vahegharakhanyan

#### Education

**Columbia University** 

Aug 2019 - present

PHD MATERIALS SCIENCE AND ENGINEERING MS MATERIALS SCIENCE AND ENGINEERING

GPA: 4.33 / 4.00 GPA: 4.04 / 4.00

 Relevant Coursework: Machine Learning, Computational Math, Numerical Methods, Atomistic Simulations, Computing Electronic Structure, Phonon Calculations, Electric, Magnetic and Mechanical Properties, Crystallography.

#### **University of California, Berkeley**

Aug 2015 - May 2019

#### BS MATERIALS SCIENCE AND ENGINEERING, BS CHEMICAL ENGINEERING MINOR ELECTRICAL ENGINEERING AND COMPUTER SCIENCES

GPA: 3.61 / 4.00

- Relevant Coursework: Optical Engineering, Integrated Circuit Design, Information Systems, Dynamics and Control, Polymeric Materials, Thin Films, Materials Production and Design, Mass and Energy Transport, Fluid Dynamics, Phase Transformations and Kinetics, Reactor Engineering, Crystal Defects, Corrosion, Quantum Mechanics, Data Science, Data Structures, Discrete Math and Probability.
- Coursework in Pharmaceutical sciences: Molecular Biology, Microbiology, Genetics, Org. Biochem. 2013 - 2015

## Work Experience

#### Google X (X - The Moonshot Factory)

Jun 2022 - present

AI RESIDENT (GENERATIVE MODELS FOR MATERIALS DISCOVERY, COMPUTER VISION)

Mountain View, CA

- X is Alphabet's moonshot factory. I am part of a confidential team, working in the area of ML for materials recycling.
- Co-developed a patent and a workshop paper (see below) for applications related to materials discovery.

#### Google X (X - The Moonshot Factory)

*May 2021 - Dec 2021* 

Al Resident (Generative Models for Molecular Discovery)

Mountain View, CA

• Co-developed four patents (see below) for applications related to molecular discovery.

# The Quant Edge

Aug 2020 - Feb 2021

QUANTITATIVE RESEARCH INTERN (ML TRACK)

New York, NY

- Worked towards predicting soccer match results using a team-strength metric and a Poisson model for scoring, and simulating overall league standings using Monte Carlo method.
- Developed a ranking algorithm for predicting horse racing results from pairwise scores.

# Research Experience \_

#### **Urban Group at Columbia University**

Oct 2019 - present

ML & QUANTUM-GUIDED INVERSE DESIGN OF MATERIALS WITH TARGET PROPERTIES

New York, NY

- Employing (modifications of) variational autoencoders (VAEs) for inverse design of materials with desired properties.
- Representation learning of structures from local atomic environments and compression with information theory.
- Learning materials (alchemical) similarity metric from the latent space to be used in ML force-fields (ML-FF).
  Used symbolic regression to understand different melting and free energy behaviors within clusters of materials.
- Worked towards learning about different forms of melting from combined ML, short-time MD and DFT computations.

#### Asta Group at UC Berkeley

Mar 2018 - May 2019

#### THERMODYNAMICS OF CHARGED DEFECTS WITH DENSITY FUNCTIONAL THEORY

Berkelev, CA

- Employed DFT to understand how the surrounding of each atom changes after charged defect incorporation in TiO<sub>2</sub>.
- Used Python Charged Defect Toolkit (PyCDT) to post-process charged defect calculations.

#### Papers \_\_\_\_

- Garrido Torres, J. A., Gharakhanyan, V., Artrith, N., Eegholm, T. H., and Urban, A. (2021). Augmenting zero-Kelvin quantum mechanics with machine learning for the prediction of chemical reactions at high temperatures. Nature communications, 12(1), 1-9. (doi:10.1038/s41467-021-27154-2)
- Gadhiya, T., Shah, F., Vyas, N., Gharakhanyan, V., Yang, J. H., and Holiday, A. (2022). Directional Variational Transformers for continuous molecular embedding. ELLIS 2022 ML4Molecules workshop. (jku.at)
- Gharakhanyan, V., Aalto, M. S., Alsoulah, A., Artrith N., and Urban, A. (2023). Constructing and compressing global moment descriptors from local atomic environments. (2023). ICLR 2023 ML4Materials workshop.

- **Gharakhanyan, V.**, Wirth, L., Garrido Torres, J. A., Eisenberg, E., and Urban, A. (2023). Discovering melting-temperature prediction models of inorganic solids by combined regression and clustering. [in preparation]
- **Gharakhanyan, V.**, Wang, T., Chatterjee, S., Trinkle, D. R., and Urban, A. (2023). ML-accelerated molecular dynamics simulations for predicting equilibrium melting points from short non-equilibrium simulations. [in preparation]
- **Gharakhanyan, V.**,† Aalto, M. S.,† and Urban, A. (2023). Measuring the transferability of materials embeddings. († equal contribution) [in preparation]
- Wirth, L., **Gharakhanyan, V.**, Thompson, M., Lu, Z., Wang, T., Gonzalez, D., Chatterjee, S., Urban, A. and Trinkle, D. R. (2023). Representation of free energy surfaces of binary alloy systems from CALPHAD through symbolic learning studies. [in preparation]

#### Patents \_

- **Gharakhanyan, V.**, Yang, J. H., Gadhiya, T., Holiday, A. (2022). Search for candidate molecules using quantum or thermodynamical simulations and autoencoder. *U.S. Patent App.*, filing date Oct 17, 2022.
- Yang, J. H., **Gharakhanyan, V.**, Gadhiya, T., Holiday, A. (2022). Ionic liquid-based depolymerization optimization. *U.S. Patent App.*, filing date Oct 17, 2022.
- Holiday, A., Gadhiya, T., **Gharakhanyan, V.**, Yang, J. H., Vyas, N., Shah, F. (2022). Depolymerization optimization platform. *U.S. Patent App.*, filing date Oct 17, 2022.
- Gadhiya, T., Holiday, A., Shah, F., Vyas, N., Yang, J. H., **Gharakhanyan, V.** (2022). Molecular structure transformers for property prediction. *U.S. Patent App.*, filing date Oct 17, 2022.
- Holiday, A., **Gharakhanyan, V.**, Gadhiya, T., Vyas, N., and Shah, F. (2023). Machine learning platform for finding solid catalysts for depolymerization reactions. *U.S. Provisional Patent App.*, filing date Feb 8, 2023.

#### Presentations and Posters(†)

- Navigating materials design space with autoencoders to learn materials thermodynamics. APS March Meeting, March 2023, Las Vegas, NV.
- Machine learning and quantum-guided modeling of metal oxide thermodynamic properties. APS March Meeting, March 2023, Las Vegas, NV. (†)
- Combined clustering and regression for predicting melting temperatures of solids. 2022 TMS Annual Meeting, March 2022, Anaheim, CA.
- Machine learning and quantum-guided modeling of metal oxide thermodynamic properties. AIChE 4th Battery and Energy Storage Conference, The City College of New York, October 2022, New York, NY. (†)
- Machine learning and quantum-guided modeling of metal oxide thermodynamic properties at high temperatures. Columbia Electrochemical Energy Center Symposium, Columbia University, September 2022, New York, NY. (†)
- Thermodynamics of redox reactions at high temperatures with combined machine learning and density functional theory. Artificial Intelligence for Materials Science (AIMS) Workshop, July 2022, Virtual. (†)
- Predicting melting temperatures of solids with combined clustering and regression. Artificial Intelligence for Materials Science (AIMS) Workshop, July 2022, Virtual. (†)
- High-temperature chemical reactions with ML-augmented first-principles computations. Columbia University, Data Science Day, April 2022, New York, NY. (†)
- Learning melting temperatures of binary materials with clustering and regression. Columbia University, Data Science Day, April 2022, New York, NY. (†)

#### Awards \_\_\_\_\_

IMPACT Award for Excellence in Graduate Research by Data Science Group Distinguished Student Award by Forum on International Physics GERA Energy Workshop Award and DMP Ovshinsky Student Prize

Mar 2023

AMERICAN PHYSICAL SOCIETY

#### **NSF Conference Fellowship**

Jul 2021

MECHANISTIC ML AND DIGITAL TWINS (MMLDT-CSET) 2021 CONFERENCE

#### **Data Science/Medical Research Program Fellowship**

Jul 2020

President's Special Award - Paper on Mathematical Modelling of Viruses President of The Republic of Armenia - Armen Sarkissian [press]	Jun 2020
2nd place - Design Competition: The Energy Transition Challenge	May 2018
<ul> <li>CHEVRON CORPORATION AND UC BERKELEY</li> <li>Designed solar energy implementation into oil and gas company portfolios and inspired to</li> </ul>	he global energy transition.
Outstanding Tutor Award College of Chemistry at UC Berkeley	Dec 2017
President's Annual Award for the Best Student in Information Technology Synopsys, Armenia	Oct 2013
Two Bronze medals - International Chemistry Olympiads 2012 and 2013 WASHINGTON DC, USA AND MOSCOW, RUSSIA	Jul 2012, Jul 2013
Professional Service	
Research Mentor - 2 Masters, 2 Undergraduate and 2 High-school students	2020 - Present
Reviewer - Al4Mat workshop @ NeurIPS, Journal of Chemical Physics	2022 - Present
Treasurer - Columbia Materials Advantage Student Chapter	2021 - 2022
Scholarship Reviewer - UC Berkeley Achievement Award Program	May 2020
Scholarship Reviewer - UC Berkeley Leadership Award Program	May 2020
Jury Member - Baltic Chemistry Olympiad	2019 - 2020
Team Member - Chemical Engineering Jeopardy, AIChE, UC Berkeley	2017 - 2019
Volunteer - Wikimedia Armenia	2013 - 2015
Teaching Experience	
TA - Analysis of Engineering Problems course (CHEN 3020) TA - Atomistic Simulations course (CHEN 4880) TA - Computational Math: Numerical Methods course (APMA 4300) Instructor - Academic Success Program - Introduction to Statistics course COLUMBIA UNIVERSITY	Spring 2023 Spring 2021 Fall 2019, Spring 2020 Summer 2020, Summer 2021
TA - Quantum Mechanics course (Chem 120A)	Fall 2018, Spring 2019
TA - General Chemistry course (Chem 1A) Head Tutor - College of Chemistry University of California, Berkeley	Summer 2018 Fall 2017 - May 2019
Instructor - Workshop on Chemical Process Control and Dynamics Tumo Center for Creative Technologies, Yerevan, Armenia	Winter 2019
Scholarships	
Graduate Excellence Scholarship - Armenian Professional Society	2020
Chevron Scholarship - University of California, Berkeley	2019
T.Z. and Irmgard Chu Scholarship - University of California, Berkeley	2018
John M. Azarian Memorial Armenian Youth Scholarship	2018
Harut Barsamian Scholarship	2018
Hrayr Terzian Alumni Scholarship - University of California, Berkeley	2017
Margarian Scholarship for Excellence in Education	2017
Koomruian Educational Fund Scholarship	2017

# Armenian Relief Society Scholarship 2016 - 2018 Jack Arpajian Educational Foundation Scholarship 2016 - 2019

### Skills

**ML Techniques**Variational Autoencoders, Computer Vision, Graph Neural Networks,

Transformers, Gradient Boosting, Bayesian Optimization, Symbolic Regression

**Programming/Technologies**Python (TensorFlow, PyTorch, Scikit-learn, Pandas, NumPy, Seaborn),

SQL, MATLAB, Simulink, C++, Java, Git, Bash

**Computational Simulations**DFT (VASP, Quantum ESPRESSO), Molecular Dynamics (LAMMPS), Monte Carlo,

COMSOL, Aspen, Zemax, Synopsys Tools (Sentaurus), Pymatgen, AFLOW

**Analytical Analysis Methods** HPLC, GC, FTIR, UV-VIS, NMR, MS, XRD

**Languages** English, Russian, Armenian (working proficiency in all)

# **Selected Projects**

**Luys Foundation Scholarship** 

# **Compartmental Models in Epidemiology**

*Mar 2020 - June 2020* 

2015 - 2019

#### **PYTHON**

- Awarded a special prize for the paper by the President of The Republic of Armenia, Armen Sarkissian. [link]
- Modelled virus spread using compartmental models of different complexity and fitted to the country data of Armenia for future predictions on COVID-19 spread in the country.

#### **Voice-Controlled Robotic Car**

Jan 2019 - May 2019

#### PYTHON, ENERGIA

- Implemented cluster formation algorithm for voice command recognition.
- Profiled motor behavior and operating conditions and designed a closed-loop control.
- Built the front-end circuitry for the car and denoised sound signals by adding a bias to improve the classification.

Google-Yelp Maps

Nov 2016 - May 2017

#### Python, Java

• Created an image rendering algorithm to enable zoom in/out.

- Interpreted data from an XML file into a recognizable graph-map form for the program.
- Implemented A\* path-finding algorithm for navigation and designed rating-based Voronoi diagram for restaurants.

#### **Design of an N-channel Silicon MOSFET**

Mar 2019 - May 2019

#### SENTAURUS DEVICE

• Optimized channel/body dopant concentration, junction depth and spacer length to achieve off current ≤ 1 nA per micron channel width and on current ≥ 400 µA per micron channel width specifications.

# **Light-Fidelity (Li-Fi) Communications System**

*Mar 2019 - May 2019* 

#### **ZEMAX**

- Built a Li-Fi transmitter: converted data to binary information and passed through high illumination LED.
- Built a Li-Fi receiver: used a photodiode receiver and an inverting amplifier to recover the original signal.
- Modelled an optical filter as a 4f system to select the necessary data, remove noise and potential corruptions.