# Matthew R. Carbone

CV (with hyperlinks) updated 20 October 2023

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#### ■ Professional Appointments & Education

# Assistant Computational Scientist (RS3)

Jun 2021  $\rightarrow$  present

Computational Science Initiative, Brookhaven National Laboratory; Upton, New York

#### Ph.D. in Chemical Physics

Jun 2021

# M.A. in Chemical Physics

May 2017

Department of Chemistry, Columbia University; New York, New York
Department of Energy Computational Science Graduate Fellow

Sep  $2017 \rightarrow \text{Jun } 2021$ 

3.90/4.00; Ph.D. Advisor: David R. Reichman

# B.S. in Chemistry with Highest Distinction

May 2016

# B.A. in Physics with Highest Distinction

May 2016

University of Rochester; Rochester, New York 3.90/4.00; magna cum laude

# ■ Publications & Preprints

[†Equal first author contributions]

- 27. Atomic Insights into the Oxidative Degradation Mechanisms of Sulfide Solid Electrolytes. C. Cao<sup>†</sup>, M. R. Carbone<sup>†</sup>, C. Komurcuoglu, J. S. Shekhawat, K. Sun, H. Guo, S. Liu, K. Chen, S.-M. Bak, Y. Du, C. Weiland, X. Tong, D. Steingart, S. Yoo, N. Artrith, A. Urban, D. Lu & F. Wang. arXiv:2310.00794 (2023) [Submitted: Joule (high-impact journal: impact factor ~ 40)]
- 26. Emulating Expert Insight: A Robust Strategy for Optimal Experimental Design. M. R. Carbone, H. J. Kim, C. Fernando, S. Yoo, D. Olds, H. Joress, B. DeCost, B. Ravel, Y. Zhang, P. M. Maffettone. arXiv.2307.13871 (2023) [Accepted: Matter (high-impact journal: impact factor ~ 20)]
- 25. Accurate, uncertainty-aware classification of molecular chemical motifs from multi-modal X-ray absorption spectroscopy. M. R. Carbone, P. M. Maffettone, X. Qu, S. Yoo & D. Lu. arXiv:2306.16349 (2023) [Under review: The Journal of Physical Chemistry A]
- 24. Physically interpretable approximations of many-body spectral functions. S. Goswami, K. Barros & M. R. Carbone. arXiv:2306.11038 (2023) [Under review: Physical Review E]
- 23. Machine Learning-Guided Discovery of Polymer Membranes for CO2 Separation. Y. Basdogan, D. R. Pollard, T. Shastry, M. R. Carbone, S. K. Kumar & Z.-G. Wang. chemrxiv-2023-5h4s7 (2023) [Under review: Science Advances]
- 22. The Generalized Green's function Cluster Expansion: A Python Package for Simulating Polarons. M. R. Carbone,<sup>†</sup> S. Fomichev,<sup>†</sup> A. J. Millis, M. Berciu, D. R. Reichman & J. Sous. The Journal of Open Source Software 8, 5115 (2023)
- 21. Transferable Graph Neural Fingerprint Models for Quick Response to Future Bio-Threats. W. Chen, Y. Ren, A. Kagawa, M. R. Carbone, S. Y.-C. Chen, X. Qu, S. Yoo, A. Clyde, A. Ramanathan, R. L. Stevens, H. J. J. van Dam & D. Lu. arXiv.2308.01921 (2023) [Accepted: ICLMA 2023]
- 20. Harnessing Neural Networks for Elucidating X-ray Absorption Structure-Spectrum Relationships in Amorphous Carbon. H. Kwon, W. Sun, T. Hsu, W. Jeong, F. Aydin, S. Sharma, F. Meng, M. R. Carbone, X. Chen, D. Lu, L. F. Wan, M. H. Nielsen & T. A. Pham. The Journal of Physical Chemistry C 127, 16473 (2023) [Cover article]

- 19. Simulated Sulfur K-edge X-ray Absorption Spectroscopy Database of Lithium Thiophosphate Solid Electrolytes. H. Guo, M. R. Carbone, C. Cao, J. Qu, Y. Du, S. Bak, C. Weiland, F. Wang, S. Yoo, N. Artrith, A. Urban & D. Lu. Scientific Data 10, 349 (2023)
- 18. Self-driving Multimodal Studies at User Facilities. P. M. Maffettone, D. B. Allan, S. I. Campbell, M. R. Carbone, T. A. Caswell, B. L. DeCost, D. Gavrilov, M. D. Hanwell, H. Joress, J. Lynch, B. Ravel, S. B. Wilkins, J. Wlodek & D. Olds. arXiv:2301.09177 (2023) [Presented at the 36th Conference on Neural Information Processing Systems (NeurIPS 2022)]
- 17. Machine-learning the Spectral Function of a Hole in a Quantum Antiferromagnet. J. Lee, M. R. Carbone & W. Yin. Physical Review B 107, 205132 (2023)
- Decoding Structure-Spectrum Relationships with Physically Organized Latent Spaces. Z. Liang, M. R. Carbone, W. Chen, F. Meng, E. Stavitski, D. Lu, M. S. Hybertsen & X. Qu. Physical Review Materials 7, 053802 (2023)
- 15. Lightshow: a Python package for Generating Computational X-ray Absorption Spectroscopy Input Files. M. R. Carbone,<sup>†</sup> F. Meng,<sup>†</sup> C. Vorwerk, B. Maurer, F. Peschel, X. Qu, E. Stavitski, C. Draxl, J. Vinson & D. Lu. Journal of Open Source Software 8, 5182 (2023)
- 14. Uncertainty-aware Predictions of Molecular X-ray Absorption Spectra using Neural Network Ensembles.
  A. Ghose, M. Segal, F. Meng, Z. Liang, M. S. Hybertsen, X. Qu, E. Stavitski, S. Yoo, D. Lu & M. R. Carbone. Physical Review Research 5, 013180 (2022)
- 13. When not to use Machine Learning: A Perspective on Potential and Limitations. M. R. Carbone. MRS Bulletin 47, 968–974 (2022) [Invited paper]
- 12. Competition between Barrier-and Entropy-Driven Activation in Glasses. M. R. Carbone & M. Baity-Jesi. Physical Review E 106, 024603 (2022)
- Accelerated Materials Discovery: How to Use Artificial Intelligence to Speed Up Development. Chapter 3:
   Artificial intelligence for materials spectroscopy.
   S. B. Torrisi, J. M. Gregoire, J. Yano, M. R. Carbone,
   C. P. Gomes, L. Hung & S. K. Suram. Berlin, Boston: De Gruyter (2022)
- Machine-learning Kondo Physics using Variational Autoencoders and Symbolic Regression. C. Miles,
   M. R. Carbone, E. J. Sturm, D. Lu, A. Weichselbaum, K. Barros & R. M. Konik. Physical Review B 104, 235111 (2021)
- 9. Bond-Peierls Polaron: Non-exponential Mass Enhancement and Current Carrying Ground State. M. R. Carbone, A. J. Millis, D. R. Reichman & J. Sous. Physical Review B 104, L140307 (2021)
- 8. Numerically Exact Generalized Green's Function Cluster Expansions for Electron-Phonon Problems. M. R. Carbone, D. R. Reichman & J. Sous. Physical Review B 104, 035106 (2021)
- 7. Computing Anderson Impurity Model Spectra Using Machine Learning. E. J. Sturm,<sup>†</sup> M. R. Carbone,<sup>†</sup> D. Lu, A. Weichselbaum & R. M. Konik. Physical Review B 103, 245118 (2021)
- 6. Random Forest Machine Learning Models for Interpretable X-ray Absorption Near-Edge Structure Spectrum Property Relationships. S. B. Torrisi, M. R. Carbone, B. A. Rohr, J. H. Montoya, Y. Ha, J. Yano, S. K. Suram & L. Hung. npj Computational Materials 6, 109 (2020)
- 5. Microscopic Model of the Doping Dependence of Line Widths in Monolayer Transition Metal Dichalcogenides. M. R. Carbone, M. Z. Mayers & D. R. Reichman. The Journal of Chemical Physics 152, 194705 (2020) [Part of a special edition on 2D materials]
- 4. Effective Trap-like Activated Dynamics in a Continuous Landscape. M. R. Carbone, V. Astuti & M. Baity-Jesi. Physical Review E 101, 052304 (2020)
- 3. Machine-Learning X-ray Absorption Spectra to Quantitative Accuracy. M. R. Carbone, M. Topsakal, D. Lu & S. Yoo. Physical Review Letters 124, 156401 (2020)
- Classification of Local Chemical Environments from X-ray Absorption Spectra using Supervised Machine Learning. M. R. Carbone, S. Yoo, M. Topsakal & D. Lu. Physical Review Materials 3, 033604 (2019) [Editors' suggestion]

 Crystal Structures of [...]: Two Related Protected 1,2-amino Alcohols. M. R. Carbone, G. A. Centola, A. Haas, K. P. McClelland, M. D. Moskowitz, A. M. Verderame, M. S. Olezeski, L. J. Papa, S. C. M. Dorn, W. W. Brennessel & D. J. Weix. Acta Crystallographica E70, 365-369 (2014)

#### ■ Selected Proposals

**\$6.2M** in funding secured at Brookhaven National Lab since Fiscal Year (FY) 2022 ★ indicates awarded funding

- \* Air Force Research Laboratory Hub Phase II: Machine learning-driven optimal design of self-healing vitrimer composites for multi-functional coatings
  Principal Investigator; Funded starting FY 24; Awarded \$200k over 1 year
- \* Laboratory Directed Research and Development Type B: Human-AI-facility integration for the multi-modal studies on high-entropy nanoparticles
  Principal Investigator; Funded starting FY 24; Awarded \$400k over 2 years
- \* Workforce Development for Teachers and Scientists, Reaching a New Energy Sciences Workforce: Fermilab and Brookhaven Summer School Exchange Program
  Co-Investigator; Funded starting FY 23; Awarded \$600k over 6 weeks of programming
- \* Air Force Research Laboratory Hub Phase I: Machine learning-driven optimal design of self-healing vitrimer composites for multi-functional coatings
  Co-Investigator; Funded starting FY 23; Awarded \$100k over 6 months
- \* DOE Basic Energy Sciences, Chemical and Materials Sciences to Advance Clean Energy Technologies and Low-Carbon Manufacturing (DE-FOA-0002676): Harnessing the Catalytic Promise of Molybdenum Chalcogenides to Enable Aqueous Zinc Sulfur Batteries Co-Investigator; Funded starting FY 23; Awarded \$3.4M over 3 years
- \* Laboratory Directed Research and Development Type A: Precision Synthesis of Multiscale Nanomaterials through AI-guided Robotics for Advanced Catalysts Co-Investigator; Funded starting FY 22; Awarded \$1.5M over 3 years
- DOE Basic Energy Sciences, Computational Chemical Sciences Research (DE-FOA-0002608):
   Scale-bridging Polymer Upcycling Reaction Simulator (SPURS)
   Co-Investigator; Sought \$4.5M over 3 years
- DOE Basic Energy Sciences, Advanced Scientific Computing Research (DE-FOA-0002441):
   Scale-bridging Polymer Upcycling Reaction Simulator (SPURS)
   Co-Investigator; Sought \$8M over 4 years
- DOE Basic Energy Sciences, Data Science to Advance Chemical and Materials Sciences (DE-FOA-0002474): Resolving the Mechanism of Crystal Nucleation and Growth Using Adaptive Robotic In Situ Data

Co-Investigator; Sought \$3.6M over 3 years

## ■ Selected Honors & Certifications

- George Pegram Award for Meritorious Achievement in Chemical Research	May 2021
- Teaching Development Program Advanced Certification	Apr 2021
– Dr. E. W. and Maude V. Flagg Award	May 2016
– Phi Beta Kappa, Iota Chapter of New York	May 2016
- Junior Scholar Award	Oct 2015
- Carl A. Whiteman Jr. Teaching Award	May 2015
- Sigma Pi Sigma, Physics Honor Society	$\mathrm{Apr}\ 2015$

#### ■ Synergistic Activities

# Co-organizer: Machine Learning and Informatics for Chemistry and Materials

Telluride Scientific Research Center; Telluride, Colorado

- Five-day workshop: 25 Jun  $\rightarrow$  29 Jun 2023
- Landing page: telluridescience.org/meetings/workshop-details?wid=1128

# Co-organizer: National Virtual Biosecurity of Bioenergy Crops Center (NVBBCC)

Brookhaven National Laboratory; Upton, New York

- One-day workshop: 18 May 2023
- DEI Session Co-chair

# Organizer: Tutorial for Computational Modeling and Data Analysis of X-ray Absorption Spectroscopy

Center for Functional Nanomaterials, Brookhaven National Laboratory; Upton, New York

- One-day workshop: 27 Apr 2023
- Organizer & presenter

# Invited Attendee: Automated Design, Fabrication, and Characterization of DNA-based Nanomaterials

Center for Functional Nanomaterials, Brookhaven National Laboratory; Upton, New York

- Two-day workshop: 17 & 18 Jan 2023
- Landing page: bnl.gov/cemworkshop2023

# Organizer: AI and Machine Learning Technical Tutorials Series

Computational Science Initiative, Brookhaven National Laboratory; Upton, New York

- Ongoing organizer: started Jan 2023
- Landing page: bnl.gov/aiml

## Co-organizer: AI and Machine Learning Seminar Series

Brookhaven National Laboratory; Upton, New York

- Ongoing organizer: started Nov 2022
- Landing page: bnl.gov/aiml

# Co-organizer & Presenter: Short Course on Machine Learning for International Safeguards

Brookhaven, Oak Ridge and Argonne National Laboratories, United States

NA-241 Office of International Nuclear Safequards Human Capital Development Program

– Five-day workshop: 18 Jul  $\rightarrow$  22 Jul 2022

# Invited Attendee: DOE AI for Science and Security

Tennessee State University; Nashville, Tennessee

- Three-day workshop: 14 Jun  $\rightarrow$  16 Jun 2022
- Sponsoring agency: United States Department of Energy
- Landing page: ai4ss.ornl.gov

# Co-organizer and TA: BNL and NASA AI for Science Bootcamp

Brookhaven National Laboratory; Upton, New York

- Two-day workshop: 28 Jun  $\rightarrow$  29 Jun 2022
- Landing page: uat-nvidiaone.cs219.force.com/s/siteevent/a028G000001w0H5QAI/se000108

# Invited Panelist: The Department of Energy Python Exchange

Brookhaven National Laboratory; Upton, New York

- Ongoing monthly discussions: started May 2022
- Landing page: meetup.doepy.org

# Co-organizer: Data-Driven Analysis, Characterization and Modeling in Battery Development and Manufacturing

National Synchrotron Light Source II, Brookhaven National Laboratory; Upton, New York Center for Functional Nanomaterials, Brookhaven National Laboratory; Upton, New York

- One-day workshop: 26 May 2022
- Part of a multi-day National Synchrotron Light Source II (NSLSII)-Center for Functional Nanomaterials (CFN) Users' Meeting
- Landing page: bnl.gov/nslscfnum

## Developer: AI-multimodal

National Synchrotron Light Source II, Brookhaven National Laboratory; Upton, New York

- Repository link: github.com/AI-multimodal

# Organizer & Presenter: Introductory AI/ML Tutorial Series

Computational Science Initiative, Brookhaven National Laboratory; Upton, New York

- Five-day tutorial coordinator: 06 Dec  $\rightarrow$  15 Dec 2021
- A technical introduction to machine learning tutorial workshop
- Repository link: github.com/matthewcarbone/AIML-tutorials

## ■ Selected Presentations & Invited Talks

# Towards a new paradigm for machine learning-driven analysis and surrogate modeling for X-ray absorption spectroscopy Planned Mar 2024

American Physical Society; Minneapolis, Minnesota

- Invited Speaker: APS March Meeting (Subcategory 16.01.03) 2024

# When Not to Use Machine Learning

31 Jul 2023

Computational Science Initiative, Brookhaven National Laboratory; Upton, New York

- Presenter: Coffee on the Edge of Computing seminar series

## When Not to Use Machine Learning

10 Jan 2023

Brookhaven National Laboratory; Upton, New York

- Presenter: AI and Machine Learning Seminar Series (AIMS)
- Landing page: indico.bnl.gov/event/18042

#### When Not to Use Machine Learning

29 Nov 2022

Swiss Federal Institute of Aquatic Science and Technology; Switzerland

- Presenter: Systems Analysis, Integrated Assessment and Modelling Group

#### ML-driven Forward Modeling and Inverse Design of Molecules

 $03 \text{ Oct} \rightarrow 07 \text{ Oct } 2022$ 

Telluride Scientific Research Center; Telluride, Colorado

- Invited Presenter/Attendee: Machine Learning and Informatics for Chemistry and Materials
- Landing page: www.telluridescience.org/meetings/workshop-details?wid=1044

# A Primer on Machine Learning for the Natural Scientist

13 May 2022

Brookhaven National Laboratory; Upton, New York

- Invited speaker: National Synchrotron Light Source II

# Overview of AI/ML

14 Mar 2022

Brookhaven National Laboratory; Upton, New York

- Invited speaker: Artificial Intelligence and Machine Learning for IAEA Safeguards 2022

#### Series: A Non-technical Primer on Machine Learning

 $Jan \rightarrow Mar 2022$ 

Lawrence Berkeley National Laboratory; Berkeley, California

- Invited speaker: Advanced Light Source
- Three part seminar series: 19 Jan 2022, 02 Feb 2022 & 30 Mar 2022

# AI-enabled Strategies for Accelerated Materials Design

United States Department of Energy

- Invited white paper presenter: AI@DOE Roundtable Discussion

# Machine Learning in X-ray Absorption Spectroscopy

14 Dec 2020

Columbia University; New York, New York

- Invited presenter: data processing/machine learning tutorial on x-ray absorption spectra classification
- Part of a tutorial workshop for machine learning in materials science

#### The X-ray Absorption Spectroscopy Inverse Project

08 Jul 2019

Toyota Research Institute; Los Altos, California

- Invited speaker: understanding correlations between x-ray absorption spectra and local environments

# ■ Teaching, Outreach, Mentoring & DEI

# Brookhaven Mentorship Program

Brookhaven National Laboratory; Upton, New York

- 1 staff scientist Starting October 2023

# Mentored Students: Diversity Professional Leadership Network

Stony Brook University; Stony Brook, New York

- 2 students Starting August 2023

# Mentored Faculty: Summer Visiting Faculty Program

Brookhaven National Laboratory; Upton, New York

- 1 visiting faculty (Widener University)

Summer 2023

## Student Partnerships for Advanced Research and Knowledge Mentor

Nov  $2022 \rightarrow \text{present}$ 

Computational Science Initiative, Brookhaven National Laboratory; Upton, New York

- Mentor to multiple students and faculty at various high schools in New York and New Jersey
- Currently mentoring at Freeport, Commack and Watchung Hills Regional High Schools
- Landing page: bnl.gov/education/programs/program.php?q=231

# Mentored Students: Science Undergraduate Laboratory Internships (SULI)

Computational Science Initiative, Brookhaven National Laboratory; Upton, New York

 - 1 student
 Fall 2022

 - 3 students
 Summer 2022

 - 1 student
 Spring 2022

## Mentored Postdocs: Postdoc Mentoring Program

Brookhaven National Laboratory; Upton, New York

- 1 postdoc (Computational Science Initiative) Apr 2022 → present - 1 postdoc (Condensed Matter Physics and Materials Science Department) Apr 2022 → present

# Diversity, Equity & Inclusion (DEI) Council Deputy Chair

Apr  $2022 \rightarrow \text{present}$ 

# Diversity, Equity & Inclusion (DEI) Council Acting Deputy Chair

Feb  $2022 \rightarrow \text{Apr } 2022$ 

Computational Science Initiative, Brookhaven National Laboratory; Upton, New York

# Computational Science Graduate Fellowship Practicum Coordinator

Jul  $2023 \rightarrow \text{present}$ 

Computational Science Graduate Fellowship Practicum Co-Coordinator

 $Jan\ 2022 \rightarrow Jul\ 2023$ 

Brookhaven National Laboratory; Upton, New York

- 3 students scheduled practicums at the Lab in summer 2024

## Women in Science at Columbia Mentor

Oct  $2020 \rightarrow \text{May } 2021$ 

Columbia University; New York, New York

- Mentor to undergraduate women at Columbia interested in pursuing careers in science

08 Dec 2021

## USolar Outreach Education Vice President

New York, New York

- Organized volunteers and taught in-person workshops at middle schools in under-served communities
- Focused on clean energy, science, technology and policy education

# HillsHacks Hackathon Panelist & Organizer

 $Jan 2018 \rightarrow present$ 

Dec  $2018 \rightarrow \text{May } 2021$ 

Watchung Hills Regional High School; Warren, New Jersey

- Invited panelist, presenter and planning consultant
- Hackathon dates: Jan 2018, May 2019, Feb 2020, Jun 2021, May 2022 & Mar 2023

#### Graduate Teaching Assistant

Department of Chemistry, Columbia University; New York, New York

Intensive General Chemistry (UN 1604)
 General Chemistry II (UN 1404)
 Fall 2016 & Fall 2017
 Spring 2017

# David T. Kearns Center Tutor & Workshop Leader

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Jul  $2014 \rightarrow \text{May } 2016$ 

University of Rochester; Rochester, New York

Quantum mechanics, general physics and calculus tutor for first-generation and underrepresented students

# Undergraduate Teaching Assistant (†Graduate-level courses)

University of Rochester; Rochester, New York

- Thermodynamics and Statistical Mechanics (CHM 455)<sup>†</sup> head TA Spring 2016 - Physical Chemistry II (CHM 252) Spring 2015 & Spring 2016 - Organic Chemistry II (CHM 204) head TA Spring 2015, Summer 2015 & Spring 2016 - Organic Chemistry I (CHM 203) head TA Summer 2014, Fall 2014 & Fall 2015 - Chemical Instrumentation Lab (CHM 231) Fall 2015 - Advanced Physical Organic Chemistry I (CHM 433)<sup>†</sup> head TA Fall 2014 - Introductory Mechanics (PHY 113) Fall 2014 - Calculus II (MTH 162) Spring 2014 - Organic Chemistry II (CHM 204) Spring 2014 - Calculus I (MTH 161) Fall 2013 - Organic Chemistry I (CHM 203) Fall 2013

#### ■ Peer Review

#### Grants

• United States Department of Energy Small Business Innovation Research (SBIR) Grant

#### Conferences & Challenges

- 22nd IEEE International Conference on Machine Learning and Applications (ICLMA)
- Smoky Mountains Computational Sciences and Engineering Conference, Data Challenge 2023

# Peer-Reviewed Publications

- Chemistry of Materials
- Digital Discovery
- The Journal of Physics A
- The Journal of Chemical Physics
- The New Journal of Physics
- Physical Chemistry Chemical Physics

- Physical Review B
- Physical Review E
- Physical Review Letters
- Physical Review Materials
- Scientific Reports

## ■ SELECTED TECHNICAL SKILLS

## Software & version control

- Expert proficiency in Python and advanced proficiency in C++
- Expert in numerical scientific computing
- Expert proficiency using Git and GitHub (and related) in collaborative environments
- Advanced proficiency in Mathematica and Bash

# Machine learning and artificial intelligence

- Expert proficiency in PyTorch, AI pipeline design
- Expert proficiency using graph neural networks, multi-layer perceptrons, convolutional neural networks & variational autoencoders
- Advanced proficiency in Bayesian Optimization and optimal experimental design

# **High-performance computing**

- Expert proficiency in using OpenMP, MPI and SLURM on high-performance computing clusters
- Highly experienced in working on high-performance computing clusters including but not limited to NERSC Cori and the Brookhaven National Laboratory Institutional Cluster