# DHANANJAY BHASKAR

Email: dhananjay.bhaskar@yale.edu ORCID: 0000-0001-8068-3101 Contact Information GitHub: @dbhaskar92 Website:dhananjaybhaskar.com Representation Learning, Graph ML, Geometric Deep Learning, Dynamical Systems, Agent-Based Research Interests Models, Topological Data Analysis, Mathematical & Computational Biology Appointments Yale University, New Haven, CT, USA Jun 2021 - Present Postdoctoral Research Associate Yale - Boehringer Ingelheim Fellow Co-coordinator, Yale Postdoc Association Symposium Committee Advisor: Prof. Smita Krishnaswamy Brown University, Providence, RI, USA Jun 2021 - Present Visiting Scholar in Engineering Brown University, Providence, RI, USA May 2021 **EDUCATION** Ph.D. - Biomedical Engineering Sc.M. - Data Science **Dissertation:** Topological Data Analysis of Collective Motion Advisor: Prof. Ian Y. Wong University of British Columbia, Vancouver, BC, Canada May 2017 M.Sc. - Institute of Applied Mathematics **Dissertation:** Morphology-Based Cell Classification: Unsupervised Machine Learning Approach Advisor: Prof. Leah Edelstein-Keshet University of British Columbia, Vancouver, BC, Canada May 2015 B.Sc. - Combined Major in Computer Science & Mathematics (with distinction) Honors and • Outstanding Contribution Award, Yale Postdoctoral Association 2023 Awards 2023 • DAAD AINeT Fellowship for Generative Models in Machine Learning • Yale - Boehringer Ingelheim Biomedical Data Science Fellowship 2021 - 2024 • Brown Data Science Initiative Seed Grant 2020 • AMS MRC Collaborative Research Travel Grant 2019 • E Paul Sorensen Graduate Fellowship, Brown University 2017 • Faculty of Science Graduate Award, UBC 2016 • The Tenth q-bio Summer School Scholarship 2016 • International Tuition Scholarship, UBC 2015 - 2016 • International Undergraduate Summer Research Award, UBC 2014 Publications 17. Topological data analysis of spatial patterning in heterogeneous cell populations: Clustering and sorting with varying cell-cell adhesion, Bhaskar, D., Zhang, W., Volkening, A., Sandstede, B., & Wong I. arXiv:2212.14113 (to appear in npj Systems Biology and Applications) 16. Wire before you walk, Asmara, T., Bhaskar, D., Adelstein, I., Krishnaswamy, S., & Perlmutter,

M. (to appear in Asilomar Conference on Signals, Systems, and Computers, 2023)

# Publications (Cont'd)

- 15. A flowartist for high-dimensional cellular data, Macdonald, K.\*, Bhaskar, D.\*, Thampakkul, G., Nguyen, N., Zhang, J., Perlmutter, M., Adelstein, I., & Krishnaswamy S. (to appear in *IEEE MLSP 2023*)
- 14. Multiscale geometric and topological analyses for characterizing and predicting immune responses from single cell data, Venkat, A., Bhaskar, D., & Krishnaswamy, S. Trends in Immunology 44, 551-563, 2023.
- 13. Cell cycle controls long-range calcium signaling in the regenerating epidermis<sup>†</sup>, Moore, J.\*, Bhaskar, D.\*, Gao, F., Matte-Martone, C., Du, S., Lathrop, E., Ganesan, S., Shao, L., Norris, R., Sanz, N., Annusver, K., Kasper, M., Cox, A., Hendry, C., Rieck, B., Krishnaswamy, S., & Greco, V. J Cell Biol 222 (7), e202302095, 2023.
- 12. Diffusion curvature for estimating local curvature in high dimensional data, Bhaskar, D., MacDonald, K., Fasina, O., Thomas, D., Rieck, B., Adelstein, I., & Krishnaswamy S. Advances in Neural Information Processing Systems 35, 21738-21749, 2022.
- 11. Transformer-based protein generation with regularized latent space optimization, Castro E., Godavarthi A., Rubinfien J., Givechian K., Bhaskar, D.<sup>‡</sup>, & Krishnaswamy, S.<sup>‡</sup> Nature Machine Intelligence 4, 840-851, 2022.
- 10. Molecular graph generation via geometric scattering, Bhaskar, D., Grady, J., Castro, E., Perlmutter, M., & Krishnaswamy, S. *IEEE 32nd International Workshop on Machine Learning for Signal Processing (MLSP)*, Xi'an, China, pp. 1-6, 2022.
- 9. Current trends in artificial intelligence in reproductive endocrinology, Bhaskar, D., Chang, T., & Wang S. Current Opinion in Obstetrics and Gynecology, 34 (4), 159-163, 2022.
- 8. The need for speed: Migratory cells in tight spaces boost their molecular clock, Bhaskar, D., Hruska, A., & Wong, I. Cell Systems, 13 (7), 509-511, 2022.
- 7. Topological data analysis of collective and individual epithelial cells using persistent homology of loops, Bhaskar, D., Zhang, W., & Wong, I. Soft Matter 17, 4653-4664, 2021.
- 6. Analyzing collective motion with machine learning and topology, Bhaskar, D., Manhart, A., Milzman, J., Nardini, J., Storey, K., Topaz, C., & Ziegelmeier, L. *Chaos* 29, 123125, 2019.
- 5. Motility-limited aggregation of mammary epithelial cells into fractal-like clusters, Leggett, S., Neronha, Z., Bhaskar, D., Sim, J., Perdikari, T., & Wong, I. PNAS 116 (35), 17298-17306, 2019.
- 4. Breast cancer cells transition from mesenchymal to amoeboid migration in tunable 3D silk-collagen hydrogels, Khoo, A., Valentin, T., Leggett, S., Bhaskar, D., Bye, E., Benmelech, S., Ip, B., & Wong, I. ACS Biomaterials Science & Engineering 5 (9), 4341-4354, 2019.
- 3. 3D printed self-adhesive PEGDA-PAA hydrogels as modular components for soft actuators and microfluidics, Valentin, T., DuBois, E., Machnicki, C., Bhaskar, D., Cui, F., Wong, I. Polymer Chemistry 10 (16), 2015-2028, 2019.
- 2. Coupling mechanical tension and GTPase signaling to generate cell and tissue dynamics, Zmurchock, C., Bhaskar, D., & Edelstein-Keshet, L. *Physical Biology*, 15 (4), 046004, 2018.
- 1. Polarization and migration in the zebrafish posterior lateral line system, Knútsdóttir, H., Zmurchok, C., Bhaskar, D., Palsson, E., Dalle Nogare, D., Chitnis, A. B., & Edelstein-Keshet, L. *PLoS Computational Biology*, 13 (4), e1005451, 2017.
  - \* co-first authors, † cover, ‡ co-senior authors

#### Preprints

- P6 A probabilistic method for sampling α-shapes, Winn-Nuñez, E., Witt, H., Bhaskar, D., Huang, R., Wong, I., Reichner, J., & Crawford, L.
- P5 Graph Topological Property Recovery with Heat and Wave Dynamics-based Features on Graphs, Bhaskar, D., Zhang, Y., Xu, C., Sun, X., Fasina, O., Wolf, G., Nickel, M., Perlmutter, M., & Krishnaswamy, S. (submitted to *ICASSP 2024*)

# Preprints (Contd.)

- P4 Inferring dynamic regulatory interaction graphs from time series data with perturbations, Bhaskar, D., Magruder, S., De Brouwer, E., Venkat, A., Wenkel, F., Wolf, G., & Krishnaswamy, S. arXiv:2306.07803 (submitted to LoG 2023)
- P3 Capturing spatiotemporal signaling patterns in cellular data with geometric scattering trajectory homology, Bhaskar, D., Moore, J., Gao, F., Rieck, B., Khasawneh, F., Munch, E., Greco, V., & Krishnaswamy S. bioRxiv, DOI:10.1101/2023.03.22.533807
- P2 Learnable filters for geometric scattering modules, Tong, A., Wenkel, F., Bhaskar, D., Macdonald, K., Grady, J., Perlmutter, M., Krishnaswamy, S., & Wolf, G. arXiv:2208.07458 (submitted to IEEE Transactions on Signal Processing)
- P1 A methodology for morphological feature extraction and unsupervised cell classification, Bhaskar, D., Lee, D., Knútsdóttir, H., Tan, C., Zhang, M., Dean, P., Roskelley, C., & Edelstein-Keshet L. bioRxiv, DOI:10.1101/623793

# INVITED TALKS

AMS Special Session on Applied Topology: Theory, Algorithms, and Applications, Joint Mathematics Meetings (JMM), Seattle, WA	Jan	2024
Systems Medicine Seminar, University of Florida [Online]	Nov	2023
Boehringer Ingelheim Global Computational Biology & Digital Sciences (gCBDS) Seminar, Biberach, Germany	Oct	2023
Computational Health Center Seminar, Helmholtz Munich, Germany	$\mathbf{Sep}$	2023
Minisymposium on "Data-driven, Modeling and Topological Techniques in Cell and Developmental Biology", SMB Annual Meeting, Ohio State University	Jul	2023
Learning Learning Seminar, UMass Amherst	May	2023
AMS Special Session on Modeling Collective Behavior in Biology, Joint Mathematics Meetings (JMM), Boston, MA	Jan	2023
Pint of Postdoc, Yale Postdoc Association, New Haven, CT	$\mathbf{Apr}$	2022
Applied Topology Seminar, AATRN [Online]	Mar	2022
Joint UBC and U. Utah MathBio Seminar [Online]	$\mathbf{Sep}$	2021
Topological Data Analysis Seminar, Michigan State University [Online]	Aug	2021
$\label{lem:modeling} \begin{tabular}{ll} Minisymposium on "Data-driven modeling across scales - from cytoskeleton to bacterial swarms to multicellular motility to angiogenesis", SMB Annual Meeting {\it Online}{\it I} \\ \end{tabular}$		2021
Applied Topology Seminar, Mathematical Institute, University of Oxford	May	2021
Thinking Out Loud, Samuel M. Nabrit Black Graduate Student Association, Brown University	Nov	2019
BIRS Workshop on Bridging Cellular and Tissue Dynamics from Normal Development to Cancer: Mathematical, Computational, and Experimental Approaches, Banff, AB	Jun	2019
Biomedical Engineering Society (BMES) Annual Meeting, Seattle, WA	Oct	2023
$2^{\rm nd}$ Symposium on Applications of Mathematical Sciences (MathSEE), Karlsruhe Institute of Technology	Sep	2023
$3^{\rm rd}$ Graduate Student Conference: Geometry and Topology meet Data Analysis and	_	

# Contributed Talks

2<sup>nd</sup> Symposium on Applications of Mathematical Sciences (MathSEE), Karlsruhe
Institute of Technology

Sep 2023

3<sup>rd</sup> Graduate Student Conference: Geometry and Topology meet Data Analysis and
Machine Learning (GTDAML), Northeastern University

Jun 2023

42<sup>nd</sup> Department of Genetics Annual Retreat, Yale School of Medicine, Westbrook, CT Aug 2022

The 39<sup>th</sup> Annual (Online) Workshop in Geometric Topology [Online]

Jun 2022

AMS Contributed Paper Session on Algebraic Topology and Knot Theory,
Joint Mathematics Meetings (JMM), Seattle, WA [Online]

Jan 2022

Contributed	2 <sup>nd</sup> Workshop on Topological Methods in Data Analysis, Heidelberg University [Onl	ine   Oct 2021
Talks	83 <sup>rd</sup> New England Complex Fluids Meeting, UMass Amherst	Jun 2020
(Cont'd)	Continua Research Society Colloquium, Brown University	Apr 2019
	10 <sup>th</sup> Annual q-bio Conference, Vanderbilt University	Jul 2016
	Canadian Undergraduate Mathematics Conference, Carleton University	Jul 2014
	Canadian Undergraduate Mathematics Conference, Université de Montréal	Jul 2013
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POSTER	$6^{\rm th}$ Montreal AI and Neuroscience (MAIN) Conference, Montreal, QC	Dec 2022
Presentations	17 <sup>th</sup> Machine Learning in Computational Biology (MLCB) Conference [Online]	Nov 2022
	Conference on the Mathematical Theory of Deep Neural Networks (DeepMath), UC San Diego	Nov 2022
	Biomedical Engineering Society (BMES) Annual Meeting, San Antonio, TX	Oct 2022
	21st European Conference on Computational Biology (ECCB), Sitges, Spain	Sep 2022
	Bridging Applied and Quantitative Topology Workshop, AATRN [Online]	May 2022
	Workshop on Geometrical and Topological Representation Learning, ICLR [Online]	Apr 2022
	Learning Meaningful Representations of Life (LMRL) Workshop, NeurIPS [Online]	Dec 2021
	ELLIS Machine Learning for Molecule Discovery Workshop, NeurIPS [Online]	Dec 2021
	Applied Algebraic Topology Research Network (AATRN) Poster Session [Online]	Oct 2021
	American Society for Reproductive Medicine Scientific Congress & Expo [Online]	Oct 2020
	Society for Mathematical Biology Annual Meeting <sup>†</sup> [Online]	Aug 2020
	New England Computer Vision Conference, Brown University	Dec 2019
	Biomedical Engineering Society (BMES) Annual Meeting, Philadelphia, PA	Oct 2019
	Frontiers in Biophysics Conference, UBC	Jun 2017
	Frontiers in Biophysics Conference, SFU	Jun 2016
	Multidisciplinary Undergraduate Research Conference, UBC	Mar 2015
	Frontiers in Biophysics Conference, UBC	Mar 2015
	Mathematics at the Frontier of Developmental Biology Workshop, PIMS/UBC	Jul 2014
	† Winner of the best poster award in the Mathematical Oncology subgroup	
TEACHING	Guest Lectures:	
EXPERIENCE	MATH 322a - Geometric and Topological Methods in Machine Learning	Yale, Fall '22
		ner@Brown '19
	Graduate/Undergraduate Teaching Assistant:	
	DATA 1010 - Probability, Statistics & Machine Learning Brown Univ	versity, Fall '19
		versity, Fall '18
		nmer '16 & '17
	MATH 257/316 - Partial Differential Equations  MATH 256 - Differential Equations  U	UBC, Fall '16 BC, Spring '16
	MATH 250 - Differential Equations  MATH 253 - Multivariable Calculus	UBC, Fall '15
	MATH 307 - Applied Linear Algebra	UBC, Fall '15

UBC, Spring '13 & '14

UBC, Fall '12

 $\mathbf{CPSC}$ 259 - Data Structures & Algorithms for Electrical Engineers

 $\mathbf{CPSC}$ 260 - Data Structures & Algorithms for Computer Engineers

Teaching
EXPERIENCE
(Cont'd)

CPSC 260 - Object-Oriented Program Design (old syllabus)

UBC, Summer '11

CPSC 101 - Connecting with Computer Science

UBC, Spring '11, Summer '11

CPSC 211 - Introduction to Software Development (old syllabus)

UBC, Fall '10

**Summer 2021** 

- Developed autograder software, lectured on OpenMP, MPI and OpenACC, and mentored HPCrelated course projects for ENGN 2912B
- Taught tutorial sections for all Computer Science (CPSC) courses and MATH 256 at UBC

## Pedagogical Training:

Inclusive Leadership Training, Yale DEI Office	2023
Teaching Consultant Program, Brown Sheridan Center	2020
Course Design Seminar, Brown Sheridan Center	2020
Reflective Teaching Seminar, Brown Sheridan Center	2019
Instructional Skills Workshop, UBC Center for Teaching, Learning and Technology	2016

# MENTORSHIP

## Yale College First-Year Summer Research Fellowship in the Sciences & Engineering

Topic: Adversarial Knowledge Graph Embedding for Indication Expansion Summer 2022

Student: Garrek Chan (Saybrook College, Class of 2025)

## Summer Undergraduate Math Research at Yale (SUMRY)

Topic: Directed-graph based Inference in Machine Learning

Summer 2022

**Students:** Tesfa Asmara, Kincaid MacDonald, Nhi Nguyen, Guy Thampakkul & Joia Zhang

Topic: Diffusion Geometry and Topology Students: Kincaid MacDonald, Jennifer Paige, Dawson Thomas & Sarah Zhao

### **Independent Study Projects**

Topic: Identifying Transitions in Collective Cell Behavior using TDA Spring 2020

Student: William Zhang (Brown University, Sc.B.'22)

Topic: Diffusion Geometry and Topology Fall 2020

Student: William Zhang (Brown University, Sc.B.'22)

#### BrownConnect Collaborative SPRINT Award

Topic: Data-driven Modeling of Collective Motion on Curved Surfaces in 3D Summer 2020

Student: Tej Stead (Brown University, Sc.B.'23)

### Brown University Undergraduate Teaching and Research Award

Topic: Computational Models of Swarming and Collective Cell Motility Spring 2019

Student: Subhanik Purkayasta (Brown University, Sc.B.'21)

#### **Undergraduate Honors Thesis**

Topic: Profiling EMT in 3D Microenvironments Using TDA Sep 2018 - May 2019

Student: Zachary J. Neronha (Brown University, Sc.B.'19)

### NSERC Undergraduate Summer Research Award

Topic: Cell Cluster Analysis and Neighbour Detection Summer 2017

Student: Cindy Tan (UBC, B.Sc.'19)

# MENTORSHIP (Cont'd)

Topic: Simulating Cell-Cell Interactions and Migration in Multicellular Tissues Summer 2017

Student: MoHan Zhang (UBC, B.Sc.'18)

Topic: Morphology-Based Cell Classification Summer 2016

Student: Darrick Lee (UBC, B.A.Sc.'16)

Topic: Extending the CHASTE Open Source C++ Simulation Library Summer 2015

Student: Eviatar Bach (UBC, B.Sc.'17)

# SERVICE AND LEADERSHIP

## Co-Organizer:

AMS Special Session on "Geometry and Topology of High-Dimensional Biomedical Data", Joint Math Meetings, San Francisco, CA

Jan 3-6, 2024

6<sup>th</sup> Annual Yale Postdoc Symposium, Yale University, New Haven, CT May 25, 2023

Minisymposium on "The Convergence of Data, Geometry, and Biology: Insights from the 'shape' of Biological Data", Sigma Xi International Forum for Research Excellence (IFoRE), Alexandria, VA

Nov 3-6, 2022

#### Reviewer:

Journals: Nature Communications Materials, Cell Systems, PLOS Computational Biology, npj Systems Biology and Applications

Conferences: RSGDREAM 2022 (RECOMB/ISCB), SampTA 2023, NeurIPS 2023,

ICLR 2023

Workshops: LMRL Workshop 2022 (NeurIPS)

## Membership:

Professional: SMB (since 2017), AMS (since 2019), BMES (since 2019), IEEE (since 2022), SIAM (since 2023)

Honor Societies: Sigma Xi, Golden Key International Honour Society

# Workshops and Training

Virtual Hands-on Workshop on Computational Biophysics, National Center for Multiscale Modeling of Biological Systems (MMBioS) [Online]	Jul 5 - 8, 2022
OxML.2020 Machine Learning Summer School $^{\dagger},$ Oxford University $[Online]$	Aug 17 - 25, 2020
Petascale Computing Institute [Online]	Aug 19 - 23, 2019

AMS Mathematic Research Communities Program on Modeling in

Biological and Social Systems, West Greenwich, RI

Research Computing Summer School, UBC

Jun 17 - 23, 2018

Jun 19 - 22, 2017

Tenth q-bio Summer School on Membrane Dynamics, University of

New Mexico 

Jul 11 - 22, 2016

EMBO Course on Multi-level Modelling of Morphogenesis, John Innes

Centre, Norwich, UK

Jul 12 - 24, 2015

Joint CAMBAM-MBI-NIMBioS Summer School on Nonlinear Dynamics in Biological Systems, McGill University

Biological Systems, McGill University

Jun 1 - 12, 2015

† Among top 12% applicants accepted into the program