Soroor Hediyeh-zadeh

CONTACT Information

▼ soroor.hediyehzadeh@helmholtz-munich.de

RESEARCH PROFILES

in LinkedIn

★ Website

g Google Scholar profile

• https://github.com/soroorh

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RESEARCH INTERESTS

Deep Generative Models, Continual Learning, Causal Representation Learning,

Continual Causality

EDUCATION

Helmholtz Munich

2021 - 2024 (expected)

Institute of Computational Biology (ICB) $\,$

Doctor of Philosophy (PhD)

Thesis title: Continual and Causal Representation Learning for the study of molecular aberrations and perturbations in single cell gene expression data

Project title: Modeling pharmacological β -cell treatment in diabetes

using deep representation learning

Supervisors: Fabian J. Theis, Heiko Lickert

The University of Melbourne

2020 - 2022

Department of Medical Biology (WEHI)

Master of Philosophy (MPhil)

Thesis: Statistical and Machine learning models for the analysis of

label-free mass spectrometry data

Supervisors: Melissa J Davis, Andrew I. Webb

The University of Melbourne

2017-2019

School of Mathematics and Statistics M.S., Statistics and Stochastic Processes

Thesis: Differential expression analysis of RNA-seq data at the

transcript level

Supervisors: Gordon K Smyth, Melissa J Davis, Yunshun Chen

The University of Melbourne

2012-2015

School of Mathematics and Statistics B.S., Statistics and Stochastic Processes

Undergraduate Project: Statistical analysis of RNA-seq data

Supervisors: Gordon K Smyth, Alexandra Garnham

EMPLOYMENT

Walter and Eliza Hall Institute of Medical Research

2016-2020

Bioinformatics Division Research Assistant

Advisor: Melissa J Davis Role: Analysis of high-throughput sequencing data, including RNA-seq, ChIP-seq, ATAC-seq, SLAM-seq, scRNA-seq, and shotgun proteomics data. Developed methods for data integration,

understanding cellular heterogeneity in single-cell RNA-seq data. Also co-supervised a visiting student March 2019 - June 2019.

The University of Melbourne

2014-2016

School of Engineering, Systems Biology Laboratory UROP Student/Research Technician

Project title: Identifying the molecular networks disrupted in

metastasising carcinoma Supervisor: Melissa J Davis

Role: Database development, transcription factor motif analysis

Publications

Preprints

Note: * indicates co-authorship

- [1] Litinetskaya, A., Shulman, M., <u>Hediyeh-zadeh</u>, S., Moinfar, A. A., Curion, F., Szalata, A., ... Theis, F. J. (2024). *Multimodal weakly supervised learning to identify disease-specific changes in single-cell atlases*. bioRxiv, 2024-07.
- [2] Quan Xu,#, Lennard Halle,#, Soroor Hediyeh-zadeh*, Merel Kuijs*, Umut Kilik, Qianhui Yu, Tristan Frum, Lukas Adam, Shrey Parikh, Manuel Gander, Raphael Kfuri-Rubens, Dominik Klein, Zhisong He, Jonas Simon Fleck, Koen Oost, Maurice Kahnwald, Silvia Barbiero, Olga Mitrofanova, Grzegorz Jerzy Maciag, Kim B. Jensen, Matthias Lutolf, Prisca Liberali, Joep Beumer1, Jason R. Spence, Barbara Treutlein,*, Fabian J. Theis,*, J. Gray Camp,* An integrated transcriptomic cell atlas of human endoderm-derived organoids.
- [3] Hediyeh-zadeh*, S., Whitfield*, H. J., Kharbanda, M., Curion, F., Bhuva, D. D., Theis, F. J., Davis, M. J. (2023). *Identification of cell types, states and programs by learning gene set representations.* bioRxiv, 2023-09.
- [4] Aliee, H., Kapl, F., Hediyeh-Zadeh, S., Theis, F. J. (2023). Conditionally Invariant Representation Learning for Disentangling Cellular Heterogeneity. arXiv preprint arXiv:2307.00558.
- [5] Hediyeh-zadeh, S., Davis, M. J., Webb, A. I. (2021). PIPP: Improving peptide identity propagation using neural networks. bioRxiv.

Peer-Reviewed Journal Articles

- [1] Mayar Ali, Merel Kuijs, Soroor Hediyeh-zadeh*, Tim Treis*, Karin Hrovatin, Giovanni Palla, Anna C Schaar, Fabian J Theis, GraphCompass: spatial metrics for differential analyses of cell organization across conditions, Bioinformatics, Volume 40, Issue Supplement_1, July 2024, Pages i548–i557, https://doi.org/10.1093/bioinformatics/btae242
- [2] Hediyeh-Zadeh, S., Fischer, T., Theis, F. (2024). Disentanglement via mechanism sparsity by replaying realizations of the past. ICLR 2024 Workshop on

Machine Learning for Genomics Explorations.

- [3] Behrens, K., Brajanovski, N., Xu, Z., Viney, E. M., DiRago, L., Hediyeh-Zadeh, S., Davis, M. J., Pearson, R. B., Sanij, E., Alexander, W. S., & Ng, A. P. (2024). ERG and c-MYC regulate a critical gene network in BCR::ABL1-driven B cell acute lymphoblastic leukemia. Science advances, 10(10), eadj8803. https://doi.org/10.1126/sciadv.adj8803
- [4] Baldoni, P. L.*, Chen, Y.*, <u>Hediyeh-Zadeh, S.</u>, Liao, Y., Dong, X., Ritchie, M. E., ... & Smyth, G. K. (2024). *Dividing out quantification uncertainty allows efficient assessment of differential transcript expression with edgeR*. Nucleic Acids Research, 52(3), e13-e13.
- [5] Goh, W., Sudholz, H., Foroutan, M., Scheer, S., Pfefferle, A., Delconte, R. B., ..., Hediyeh-Zadeh, S. (14/25) ... & Huntington, N. D. (2024). IKAROS and AIOLOS directly regulate AP-1 transcriptional complexes and are essential for NK cell development. Nature Immunology, 1-16.
- [6] De Donno, C., <u>Hediyeh-Zadeh</u>, S., Moinfar, A. A., Wagenstetter, M., Zappia, L., Lotfollahi, M., Theis, F. J. (2023). *Population-level integration of single-cell datasets enables multi-scale analysis across samples.* Nature Methods.
- [7] Sharma, S., Chung, C. Y., Uryu, S., Petrovic, J., Cao, J., Rickard, A., ... Hediyeh-Zadeh, S. (54/73), ... Paul, T. A. (2023). Discovery of a highly potent, selective, orally bioavailable inhibitor of KAT6A/B histone acetyltransferases with efficacy against KAT6A-high ER+ breast cancer. Cell Chemical Biology.
- [8] Hediyeh-Zadeh, S., Webb, A. I., Davis, M. J. (2023). MsImpute: Estimation of missing peptide intensity data in label-free quantitative mass spectrometry. Molecular and Cellular Proteomics.
- [9] Heumos*, L., Schaar*, A.C., Lance, C., Litinetskaya, A., ..., Hediyeh-Zadeh, S.,
 ..., Schiller, H., and Theis, F. J. (2023). Best practices for single-cell analysis across modalities. Nat Rev Gen.
- [10] Lotfollahi, M., Rybakov, S., Hrovatin, K., Hediyeh-Zadeh, S., Talavera-López, C., Misharin, A. V., Theis, F. J. (2023). Biologically informed deep learning to query gene programs in single-cell atlases. Nature Cell Biology, 1-14.
- [11] Chi, L. H., Cross, R. S., Redvers, R. P., Davis, M., Hediyeh-Zadeh, S., Mathivanan, S., ... Anderson, R. L. (2022). *MicroRNA-21 is immunosuppressive and pro-metastatic via separate mechanisms*. **Oncogenesis**, 11(1), 38.
- [12] Souza-Fonseca-Guimaraes, F., Rossi, G. R., Dagley, L. F., Foroutan, M., Mc-Culloch, T. R., Yousef, J., ..., <u>Hediyah-Zadeh, S.</u> (11/14),... Huntington, N. D. (2022). Tgf and cis inhibition overcomes NK-cell suppression to restore antitumor immunity. Cancer Immunology Research, 10(9), 1047-1054.
- [13] Hediyeh-zadeh, S., Lotfollahi, M., Theis, F. J. Continual single-cell architecture surgery for reference mapping. ICML 2022 Workshop on Computational Biology.
- [14] Juan, B. P. S., Hediyah-Zadeh, S., Rangel, L., Rodriguez, V., Milioli, H. H., Kohane, F., ... Chaffer, C. L. (2022). The anti-androgen seviteronel sensitizes triple-negative breast cancer to chemotherapy. Cancer Research, 82(12_Supplement), 1029-1029.
- [15] El-Saafin, F., Bergamasco, M. I., Chen, Y., May, R. E., Esakky, P., Hediyeh-Zadeh, S.,
 ... Voss, A. K. (2022). Loss of TAF8 causes TFIID dysfunction and p53-mediated apoptotic neuronal cell death. Cell Death Differentiation, 29(5), 1013-1027.

- [16] Brown, L. M., <u>Hediyeh-Zadeh, S.</u>, Sadras, T., Huckstep, H., Sandow, J. J., Bartolo, R. C., ... <u>Ekert, P. G. (2022)</u>. *SFPQ-ABL1 and BCR-ABL1 utilize different signalling networks to drive B-cell acute lymphoblastic leukaemia*. **Blood Advances**.
- [17] Wang, M., Zadeh, S., Pizzolla, A., Thia, K., Gyorki, D. E., McArthur, G. A., ... Neeson, P. J. (2022). Characterization of the treatment-naive immune microenvironment in melanoma with BRAF mutation. Journal for Immunotherapy of Cancer, 10(4).
- [18] Sharma, S., Chung, J., Uryu, S., Rickard, A., Nady, N., Khan, S., ... <u>Hediyeh-zadeh, S.</u> (47/51) Paul, T. (2021). First-in-class KAT6A/KAT6B inhibitor CTx-648 (PF-9363) demonstrates potent anti-tumor activity in ER+ breast cancer with KAT6A dysregulation. Cancer Research, 81(13_Supplement), 1130-1130.
- [19] Grisaru, S., Dulberg, S., Beck, L., Zhang C., Itan, M., Hediyeh-zadeh, S. (6/24), ... & Munitz, A. Metastasis-entrained eosinophils enhance lymphocyte-mediated anti-tumor immunity. Cancer Research, 81(21), 5555-5571.
- [20] Adolphe, C., Millar, A., Kojic, M., Barkauskas, D., Sundström, A., Swartling, F., Hediyeh-zadeh, S., Tan, C.W., Davis, M. & Genovesi, L. SOX9 defines distinct populations of cells in SHH medulloblastoma but is not required for Math1-driven tumour formation. Molecular Cancer Research, 19(11), 1831-1839.
- [21] Jacquelot, N., Seillet, C., Wang, M., Pizzolla, A., Liao, Y., <u>Hediyeh-Zadeh, S.,</u> ... & Belz, G. T. (2021). Blockade of the co-inhibitory molecule PD-1 unleashes ILC2-dependent antitumor immunity in melanoma. **Nature Immunology**, 1-14
- [22] Kojic, M., Gawda, T., Gaik, M., Begg, A., Salerno-Kochan, A., Kurniawan, N. D., ..., Soroor Hediyeh-zadeh (11/40), ... & Wainwright, B. J. (2021). Elp2 mutations perturb the epitranscriptome and lead to a complex neurodevelopmental phenotype. Nature communications, 12(1), 1-18.
- [23] Huang, Q., Jacquelot, N., Preaudet, A., Hediyeh-Zadeh, S., Souza-Fonseca-Guimaraes, F., McKenzie, A. N., ... & Belz, G. T. (2021). Type 2 Innate Lymphoid Cells Protect against Colorectal Cancer Progression and Predict Improved Patient Survival. Cancers, 13(3), 559.
- [24] Moujalled, D. M., Hanna, D. T., Hediyeh-Zadeh, S., Pomilio, G., Brown, L., Litalien, V., ... & Maragno, A. L. (2020). Cotargeting BCL-2 and MCL-1 in high-risk B-ALL. Blood advances, 4(12), 2762-2767.
- [25] Emery-Corbin, S. J., Hamey, J. J., Ansell, B. R., Balan, B., Tichkule, S., Stroehlein, A. J., ..., Hediyeh-Zadeh, S. (9/18),... & Jex, A. R. (2020). Eukaryote-conserved methylarginine is absent in diplomonads and functionally compensated in Giardia. Molecular biology and evolution, 37(12), 3525-3549.
- [26] Ng, A. P., Coughlan, H. D., <u>Hediyeh-Zadeh, S.</u>, Behrens, K., Johanson, T. M., Low, M. S. Y., ... & Boudier, T. (2020). *An Erg-driven transcriptional program controls B cell lymphopoiesis*. **Nature Communications**, 11(1), 1-14.
- [27] Wee, K., Hediyeh-zadeh, S., Duszyc, K., Verma, S., Nanavati, B., Khare, S., ... & Budnar, S. (2020). Snail induces epithelial cell extrusion by regulating RhoA contractile signaling and cell-matrix adhesion. Journal of Cell Science.
- [28] Carmichael, C. L., Wang, J., Nguyen, T., Kolawole, O., Benyoucef, A., De Mazière, C., ..., <u>Hediyeh-zadeh, S.</u> (10/37), ... & Vo, A. N. Q. (2020). The EMT modulator SNAI1 contributes to AML pathogenesis via its interaction with LSD1. **Blood**.

- [29] Louis, C., Guimaraes, F., Yang, Y., D'Silva, D., Kratina, T., Dagley, L., Hediyeh-Zadeh, S., ... & Babon, J. J. (2020). NK cell-derived GM-CSF potentiates inflammatory arthritis and is negatively regulated by CIS. Journal of Experimental Medicine, 217(5).
- [30] Delconte, R. B., Guittard, G., Goh, W., <u>Hediyeh-Zadeh, S.</u>, Hennessy, R. J., Rautela, J., ... & Huntington, N. D. (2020). *NK Cell Priming From Endogenous Homeostatic Signals Is Modulated by CIS.* Frontiers in Immunology, 11, 75.
- [31] Goh, W., Jackson, J. T., <u>Hediyeh-zadeh, S.</u>, Delconte, R. B., Andoniou, C. E., Rautela, J., ... & Huntington, N. D. (2020). *Hhex Is Essential for NK Cell Persistence by Repressing Bcl2l11-Dependent Apoptosis*. **CELL-REPORTS**-D-19-05014.
- [32] Rautela, J., Dagley, L. F., De Oliveira, C. C., Schuster, I. S., <u>Hediyeh-Zadeh, S.</u>, Delconte, R. B., ... & Kita, B. (2019). *Therapeutic blockade of activin-A improves NK cell function and antitumor immunity*. **Science signaling**, 12(596), eaat7527.
- [33] Cursons, J., Souza-Fonseca-Guimaraes, F., Foroutan, M., Anderson, A., Hollande, F., Hediyeh-Zadeh, S., ... & Davis, M. J. (2019). A gene signature predicting natural killer cell infiltration and improved survival in melanoma patients.

 Cancer immunology research, 7(7), 1162-1174.
- [34] Mielke, L. A., Liao, Y., Clemens, E. B., Firth, M. A., Duckworth, B., Huang, Q., ..., <u>Hediyeh-Zadeh, S.</u> (11/25), ... & Belz, G. T (2019). *TCF-1 limits the formation of Tc17 cells via repression of the MAF-RORYt axis*. **Journal of Experimental Medicine**, jem-20181778.
- [35] Cursons, J., Pillman, K. A., Scheer, K. G., Gregory, P. A., Foroutan, M., Hediyeh-Zadeh, S., ... & Davis, M. J. (2018). Combinatorial targeting by MicroRNAs co-ordinates post-transcriptional control of EMT. Cell systems, 7(1), 77-91.
- [36] Rautela, J., Souza-Fonseca-Guimaraes, F., Hediyeh-Zadeh, S., Delconte, R. B., Davis, M. J., & Huntington, N. D. (2018). Molecular insight into targeting the NK cell immune response to cancer. Immunology and cell biology, 96(5), 477-484.
- [37] Foroutan, M., Cursons, J., Hediyeh-Zadeh, S., Thompson, E. W., & Davis, M. J. (2017). A transcriptional program for detecting TGFB-induced EMT in Cancer. Molecular Cancer Research, 15(5), 619-631.

$Selected\ Poster\ Abstracts$

- [1] Hediyeh-Zadeh, S., Fischer, T., Theis, F. (2024). Mechanism transport between multiple data modalities using causality- inspired neural networks. Single Cell Biology 2024.
- [2] Hediyeh-Zadeh, S., Fischer, T., Theis, F. (2024). Disentanglement via mechanism sparsity by replaying realizations of the past. ICLR 2024 Workshop on Machine Learning for Genomics Explorations.
- [3] Soroor Hediyeh-zadeh, Mohammad Lotfollahi, Fabian Theis. Continual singlecell architecture surgery for reference mapping. ICML 2022 Workshop on Computational Biology
- [4] Soroor Hediyeh-Zadeh, Yi Xie, Holly Whitfield and Melissa Davis. Reference-free cell type annotation and phenotype characterisation in single cell RNA sequencing by learning geneset representations. ICML 2021 Workshop on Computational Biology

- [5] Soroor Hediyeh-Zadeh and Andrew Webb. Improving confident peptide identifications across mass spectrometry runs by learning deep representations of TIMS-MS1 features. ICML 2021 Workshop on Computational Biology
- [6] Abstract 1130: First-in-class KAT6A/KAT6B inhibitor CTx-648 (PF-9363) demonstrates potent anti-tumor activity in ER+ breast cancer with KAT6A dysregulation Shikhar Sharma, Jay Chung, Sean Uryu, Amanda Rickard, Natalie Nady, Showkhin Khan, Zhenxiong Wang, Yong Zhang, Haikuo Zhang, Pei-Pei Kung, Eric Greenwald, Karen Maegley, Patrick Bingham, Hieu Lam, Ylva E. Bozikis, Hendrik Falk, Elizabeth Allan, Vicky M. Avery, Miriam S. Butler, Michelle A. Camerino, Catalina Carrasco-Pozo, Susan A. Charman, Melissa J. Davis, Mark A. Dawson, Dawson Sarah-Jane, Melanie de Silva, Matthew L. Dennis, Olan Dolezal, Rachel Lagiakos, Geoffrey J. Lindeman, Laura MacPherson, Stewart Nuttall, Thomas S. Peat, Bin Ren, Alexandra E. Stupple, Elliot Surgenor, Chin Wee Tan, Tim Thomas, Jane E. Visvader, Anne K. Voss, Francois Vaillant, Karen L. White, James Whittle, Yuqing Yang, Soroor Hediyeh-Zadeh, Paul A. Stupple, Ian P. Street, Brendon J. Monahan and Thomas Paul Cancer Res July 1 2021 (81) (13 Supplement) 1130; DOI: 10.1158/1538-7445.AM2021-1130

Supervision & Mentoring

Mikkel Rassmusen, *MSc student*, Technical University of Denmark, 2024 Causality-inspired probabilistic model of cell state transition in response to perturbations in single cell transcriptomics

Ismail Benayed, *BSc student*, Technical University of Munich, 2024 A deep probabilistic model for variance estimation in single cell perturbation data

Georgiana Barbut, *MSc student*, Technical University of Munich, 2024. Causality-inspired probabilistic model of cell state transition in response to perturbations in single cell transcriptomics

Rashika Jakhmola, *MSc student*, Technical University of Munich, 2024 Comparative Atlas Construction by Continual Learning Applications to a Colorectal Cancer Atlas

Lucas Ronchetti, *BSc student*, Technical University of Munich (TUM), 2023 Thesis Title: An uncertainty-aware deep learning framework for match-between-runs in TIMS-MS/MS proteomics data

Tom Fischer, *MSc student*, Technical University of Munich (TUM), 2023 Thesis Title: Continual learning of causal mechanisms: applications in bulk and single cell transcriptomics

Rasmus Moller Larsen, *MSc student*, Technical University of Denmark (DTU), 2023

Thesis Title: Deep generative modelling for single cell mass spectrometry

Jack Finlay, Visiting HIDA scholar, Duke University (visiting Helmholtz Munich), 2023

Research project: Linking healthy cell atlases to disease cell atlases: applications to an integrated Colorectal Cancer Atlas

Yi Xie, Visiting student, WEHI, 2019

Research project: Identification of cell types, states and programs by learning gene set representations

TALKS

Selected Invited MsImpute: Estimation of missing peptide intensity values in label-free mass spectrometry. BioC Asia 2021. Virtual. [Recording]

> Mapping phenotypic similarities using single cells manifold, Joint GIW/ABACBS 2019. Sydney, Australia.

> Mapping phenotypic similarities using single cells manifold, 10X Genomics User Group, Melbourne, November 2019.

Supervised deconvolution of population heterogeneities in single cell RNA-seq via similaritybased embeddings, Victorian Cancer Bioinformatics Symposium 2019.

Supervised deconvolution of population heterogeneities in single cell RNA-seq via similaritybased embeddings, OZ Single Cells meeting 2019.

Using Docker to make biomedical research outcomes reproducible, Tech Talk: Using Docker-like Containers in Service Deployment (Online Meetup). https://rcc.uq. edu.au/event/1854/tech-talk-using-docker-containers-service-deployment (April 2018)

Computational workflows for research students: towards a reproducible research, COM-BINE Student Symposium. (November 2016)

OPPAR: Outlier Profile and Pathway Analysis, bioCasia2016. (November 2016)

Talks and SEMINARS

Emerging topics in continual learning for computational biology, Continual AI Seminars, March 2023. [Abstract] [Recording]

Machine Learning in Biology: Learning meaningful representations of life, WEHI Machine Learning Interest Group, June 2020.

Methods for imputation, differential expression and multi-Omics integration of proteomics data, WEHI Bioinformatics Seminars, April 2019

Funds & Awards

German Academic Exchange (DAAD) scholarship (Awarded Aug 2024) Single Cell Biology 2024 conference Travel Bursary

Partial funds from Colonial Foundation towards MPhil degree 2020-2021

Australian Postgraduate Award (Fee Remission) 2020-2022

ICML 2021 Workshop on Computational Biology Fellowship

WiML ICLR 2021 Registration Fee Funding, 2021

WiML NeurIPS 2020 Registration Fee Funding, 2020

WEHI Bioinformatics Travel Award, 2020

Kellaway Excellence Education Award, 2019

BiocAsia 2016 meeting Travel Award

Winter School in Mathematical and Computational Biology Travel Bursary, 2014 Australian Neurogenetics Conference Travel Award, 2014

Programming Languages Proficient: R, Python, Bash, LATEX

Software

msImpute: Peptide-level imputation in mass spectrometry label-free proteomics by low-rank approximation. DOI: https://doi.org/doi:10.18129/B9.bioc.msImpute

scDECAF: Reference-free cell type and phenotype annotation by learning geneset representations. source code: https://github.com/DavisLaboratory/scDECAF

oppar - An R/Bioconductor package for outlier profile analysis in cancer samples. DOI: https://doi.org/doi:10.18129/B9.bioc.oppar

Professional Services

Program/Proceedings Reviews

▷AISTATS 2024 reviewer (Machine Learning)

▷ISMB/ECCB 2023 Proceedings programme external reviewer

▷useR! 2018 conference organising committee; abstract reviewer

Committees and Societies

- ◆Helmholtz Munich STEM-Tisch (2022 present) Co-founder
- ♦WEHI Machine Learning Special Interest Group (2020 2021) Co-organiser
- \diamond WEHI Deep Learning in Medical Biology Symposium 2020 Co-organiser
- ♦ ABACBS 2017 organising committee COMBINE training coordinator

Workshops

- ▶ Package development and publishing in R. R-Ladies Urmia, June 2022. Speaker
- ▶ Producing publication-ready documents in R Markdown. R-Ladies Melbourne, Feb 2019. Speaker and co-organiser
- ▶ Semi-parametric and non-parametric models in R. R-Ladies Melbourne, December 2018. Speaker and co-organiser
- ▶ Parallel Programming in R. R-Ladies Melbourne, March 2018. Speaker and coorganiser
- ▶Introduction to R Shiny. R-Ladies Melbourne, November 2017. Speaker and coorganiser
- ► COMBINE R for Bioinformatics. May 2017. Training instructor and organiser
- ► Version Control and Project Management with Git. R-Ladies Melbourne, May 2017. Speaker and co-organiser
- ► COMBINE R software Carpentry workshop. April 2017. Training instructor and organiser