Shankara K. Anand



ABOUT

I am a rising fourth year medical student at Boston University School of Medicine passionate about hematology/oncology and applying ML/AI to clinical practice. I have a masters from Stanford where I completed coursework in machine & deep learning and 4+ years of experience as a computational biology researcher at the Broad Institute of MIT & Harvard. My expertise includes single-cell genomics, multi-omic integration, and structural proteomics with an emphasis on algorithmic development.

EDUCATION

M.D. Candidate, Boston University, *Boston, MA* (exp.) 2024
M.S. Biomedical Informatics, Stanford University, *Stanford, CA* 2019
B.S. Chemical Engineering, Stanford University, *Stanford, CA* 2017

RESEARCH

Associate Computational Biologist, Broad Institute of MIT & Harvard Aug. 2018 - Present Supervised by Dr. Gad Getz & the Genotype Tissue Expression Experiment (GTEx)

- Led computational direction of pan-cancer, proteogenomic study (CPTAC)
- Mapped a single-nucleus, cross-tissue, transcriptome atlas of the human body (GTEx)
- Risk stratified Smoldering Multiple Myeloma patients with genomics (advised by Dr. Irene Ghobrial)

Researcher, Stanford Dept. of Bioengineering

Jan. - June 2018

Last updated: March 13, 2023

Supervised by Dr. Possu Huang

- Designed de novo, end-to-end (computational to wet-lab) proteins using Rosetta software
- Predicted ligand binding sites of proteins using deep learning frameworks (GitHub)

Scientific Intern, Novartis

Summer 2017

Computer Aided Drug Discovery Team

- Developed machine learning framework for detecting pKa of in-house compounds
- Published work in Journal of Chemical Information & Modeling

Research Intern, Genentech

Summer 2016

April 2021 - March 2022

Early Stage Pharmaceutical Development

Student Leader, BUSM Genetics Interest Group

• Built computational pipeline for running large molecular dynamics simulations to investigate surfactant structure and antibody degradation

LEADERSHIP

Student Leader, BUSM in. Vision Tech x Medicine Group	April 2021 - March 2022	
STEM Tutor, Stanford Academic Resource Center	Summer 2017	
Dance Captain, Stanford Basmati Raas (Indian Dance)	Sept. 2013 - June 2018	
Resident Assistant, 2x years at Stanford Residential Education	Sept. 2015 - June 2017	
Program Coordinator, Stanford LGBT Community Resource Center	Sept. 2015 - June 2017	
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VOLUNTEER

Child Life Volunteer, Boston Children's Hospital Oncology (150 hrs)	Oct. 2018 - Feb. 2020
Fundraising Coordinator & Volunteer, Stanford Camp Kesem (650 hrs)	April 2016 - July 2018
Reading Tutor, Stanford Ravenswood Reads (120 hrs)	Spring 2016

AWARDS

American Association of Cancer Research: Scholar in Training Award	
American Society of Hematology: Abstract Achievement Award	2021
Stanford Achievement Award, awarded to 10% of graduating class	2017
Genentech Outstanding Student Award, selected Junior in Chemical Engineering	2016

SKILLS Advanced: Python, R, PyTorch, TensorFlow, git

Basic: Matlab, LATEX

SOFTWARE

Signature Analyzer: a fast, GPU enabled implementation of bayesian non-negative matrix factorization for extracting mutational and genomic expression signatures (GitHub).

CLUMPS-PTM: an algorithm for identifying 3D clusters of post-translational modifications (GitHub).

CLUMPS-2: an algorithm for identifying 3D clusters of somatic mutations (GitHub).

Mudi: python utilities for single-cell RNA-sequencing analyses (GitHub).

SITEFINDER: using deep learning to identify ligand site binding in proteins (Stanford CS231n) (GitHub).

PUBLICATIONS Pre-Prints

[1] Rouhana, J. M., Wang, J., Eraslan, G., **Anand, S.**, Hamel, A. R., Cole, B. et al. ECLIPSER: identifying causal cell types and genes for complex traits through single cell enrichment of e/sQTL-mapped genes in GWAS loci. bioRxiv (2021). doi: 10.1101/2021.11.24.469720

Peer-Reviewed Publications

- † indicates co-first authorship
- [‡] indicates co-second authorship
- [1] Boiarsky, R., Haradhvala, N. J., Alberge, J. B., Sklavenitis-Pistofidis, R., Mouhieddine, T. H., Zavidij, O. et al. Single Cell Characterization of Myeloma and its Precursor Conditions Reveals Transcriptional Signatures of Early Tumorigenesis. **Nature Communications**, 13, 7040 (2022). doi: 10.1038/s41467-022-33944-z
- [2] Sklavenitis-Pistofidis, R., Aranha, M. P., Redd, R. A., Baginska, J., Haradhvala, N. J., Hallisey, M., et al. Immune biomarkers of response to immunotherapy in patients with high-risk smoldering myeloma. **Cancer Cell**, 40(11), 1358-1373 (2022). doi: 10.1016/j.ccell.2022.10.017
- [3] Yaron, T. M., Heaton, B. E., Levy, T. M., Johnson, J. L., Jordan, T. X., Cohen, B. M. et al. Host protein kinases required for SARS-CoV-2 nucleocapsid phosphorylation and viral replication. **Science Signaling**, 15(757) (2022). doi: 10.1126/scisignal.abm0808
- [4] Roh, W., Geffen, Y., Cha, H., Miller, M., **Anand, S.**, Kim, J. et al. High-resolution profiling of lung adenocarcinoma identifies expression subtypes with specific biomarkers and clinically relevant vulnerabilities. **Cancer Research** (2022). doi: 10.1158/0008-5472.CAN-22-0432
- [5] Knisbacher, B. A., Lin, Z., Hahn, C. K., Nadeu, F., Duran-Ferrer, M., Stevenson, K. E. et al. The CLL-1100 project: towards complete genomic characterization and improved prognostics for CLL. Nature Genetics, 1-11 (2022). doi: 10.1038/s41588-022-01140-w
- [6] Bustoros, M.[†], **Anand, S.[†]**, Sklavenitis-Pistofidis, R. et al. Genetic subtypes of smoldering multiple myeloma are associated with distinct pathogenic phenotypes and clinical outcomes. **Nature Communications**, 13, 3449 (2022). doi: 10.1038/s41467-022-30694-w (GitHub)
- [7] Eraslan, G.[†], Drokhlyansky, E.[†], **Anand, S.[‡]**, Fiskin, E.[‡], Subramanian, A.[‡], Sylper, M.[‡], Wang, J.[‡] et al. Single-nucleus cross-tissue molecular reference maps toward understanding disease gene function. **Science**, 376(6594) (2022). doi: 10.1126/science.abl4290
- [8] Beauchamp, E. M., Leventhal, M., Bernard, E., Hoppe, E. R., Todisco, G., Creignou, M. et al. ZBTB33 is mutated in clonal hematopoiesis and myelodysplastic syndromes and impacts RNA splicing. Blood Cancer Discovery, 2(5), 500-517 (2021). doi: 10.1158/2643-3230.BCD-20-0224
- [9] Satpathy, S., Krug, K., Beltran, P. M. J., Savage, S. R., Petralia, F., Kumar-Sinha, C. et al. A proteogenomic portrait of lung squamous cell carcinoma. Cell, 184(16), 4348-4371 (2021). doi: 10.1016/j.cell.2021.07.016
- [10] de Goede, O. M., Nachun, D. C., Ferraro, N. M., Gloudemans, M. J., Rao, A. S., Smail, C. et al. Population-scale tissue transcriptomics maps long non-coding RNAs to complex disease. **Cell**,

- 184(10), 2633-2648 (2021). doi: 10.1016/j.cell.2021.03.050
- [11] Jiang, L., Wang, M., Lin, S., Jian, R., Li, X., Chan, J. et al. A quantitative proteome map of the human body. **Cell**, 183(1), 269-283 (2020). doi: 10.1016/j.cell.2020.08.036
- [12] Ferraro, N. M., Strober, B. J., Einson, J., Abell, N. S., Aguet, F., Barbeira, A. N. et al. Transcriptomic signatures across human tissues identify functional rare genetic variation. **Science**, 369(6509) (2020). doi: 10.1126/science.aaz5900
- [13] GTEx Consortium. The GTEx Consortium atlas of genetic regulatory effects across human tissues. **Science**, 369(6509), 1318-1330 (2020). doi: 10.1126/science.aaz1776
- [14] Bustoros, M., Sklavenitis-Pistofidis, R., Park, J., Redd, R., Zhitomirsky, B., Dunford, A. J. et al. Genomic profiling of smoldering multiple myeloma identifies patients at a high risk of disease progression. **Journal of Clinical Oncology**, 38(21), 2380 (2020). doi: 10.1200/JCO.20.00437
- [15] Taylor-Weiner, A., Aguet, F., Haradhvala, N. J., Gosai, S., **Anand, S.**, Kim, J. et al. Scaling computational genomics to millions of individuals with GPUs. **Genome Biology**, 20(1), 1-5 (2019). doi: 10.1186/s13059-019-1836-7
- [16] Lu, Y., **Anand, S.**, Shirley, W., Gedeck, P., Kelley, B. P., Skolnik, S. et al. Prediction of p K a using machine learning methods with rooted topological torsion fingerprints: application to aliphatic amines. **Journal of Chemical Information and Modeling**, 59(11), 4706-4719 (2019). doi: 10.1021/acs.jcim.9b00498
- [17] Anand, S., Kalesinskas, L., Smail, C., & Tanigawa, Y. SNPs2ChIP: Latent Factors of ChIP-seq to infer functions of non-coding SNPs. Proceedings of the Pacific Symposium (pp. 184-195) (2018). doi: 10.1142/9789813279827_0017

PRESENTATION Talks

- [1] Roh, W., Geffen, Y., Miller, M., Anand, S., Kim, J., Heiman, D. et al. Identification and proteogenomic characterization of novel lung adenocarcinoma subtypes with therapeutic relevance. American Association of Cancer Research (AACR), 82(12_Supplement), 2151-2151 (2022). doi: 10.1158/1538-7445.AM2022-2151
- [2] Kubler, K., Nardone, A., Anand, S., Gorvich, D., Droog, M., Hermida-Prado, F. et al. Abstract GS2-09: Tamoxifen instigates uterine cancer development by activating PI3K signaling and supersedes PIK3CA driver mutations. San Antonio Breast Cancer Symposium (SABCS), 82(4_Supplement) (2021). doi: 10.1158/1538-7445.SABCS21-GS2-09
- [3] Sklavenitis-Pistofidis, R., Dutta, A. K., Ujwary, S., Redd, R. A., Savell, A., Fléchon, L. et al. Single-Cell RNA-Sequencing Identifies Immune Biomarkers of Response to Immunotherapy in Patients with High-Risk Smoldering Myeloma. **American Society of Hematology (ASH)**, 138, 330 (2021). doi: 10.1182/blood-2021-147623
- [4] **Anand, S.**[†], Bustoros, M.[†], Sklavenitis-Pistofidis, R., Redd, R. A., Boyle, E. M., Tai, Y. T. et al. Genomic Profiling of Smoldering Multiple Myeloma Classifies Molecular Groups with Distinct Pathogenic Phenotypes and Clinical Outcomes. **American Society of Hematology (ASH)**, 138, 723 (2021).
- [5] **Anand, S.** "Genomic profiling of smoldering myeloma identifies high- and low- risk patients | ASH 2021." **The Video Journal of Hematological Oncology**, Dec. 12, 2021. Interviews: Part 1. Part 2.
- [6] Geffen, Y.[†], Anand, S.[†], Akiyama, Y.[†], Yaron, T. M., Kerelsky, A., Johnson, J. L., ... & Oncogenic Drivers and Pathways Group, Clinical Proteomic Tumor Analysis Consortium (CPTAC). Patterns and regulation of post translational modifications in cancer. American Association of Cancer Research (AACR), 81(13_Supplement), 16-16. doi: 10.1158/1538-7445.AM2021-16

Posters & Abstracts

- [1] **Anand, S.**, Geffen, Y., Akiyama, Y., Aguet, F., Getz, G. *CLUMPS-PTM*: Spatial Clustering of Post-Translational Modifications Across Cancer Types. **American Association of Cancer Research** (**AACR**) (2023, *upcoming*).
- [2] Boiarsky, R., Haradhvala, N., Sklavenitis-Pistofidis, R., Mouhieddine, T. H., Alberge, J. B., Zavidij, O. et al. Single Cell Characterization of Myeloma and its Precursor Conditions Reveals Transcriptional Signatures of Early Tumorigenesis. American Society of Hematology (ASH), 138, 2219 (2021). doi: 10.1182/blood-2021-150889
- [3] Akiyama, Y., Geffen, Y., Anand, S., Yaron, T., Johnson, J. L., Huntsman, E. et al. Pan-cancer proteogenomic analysis reveals functional mechanisms underlying DNA repair deficiencies. American Association of Cancer Research (AACR), 82(12_Supplement), 794-794 (2022). doi: 10.1158/1538-7445.AM2022-794
- [4] **Anand, S.**, Bustoros, M., Aguet, F., Sklavenitis-Pistofidis, R., Redd, R., Zhitomirsky, B. et al. Genomic profiling of smoldering multiple myeloma classifies distinct molecular groups. **American Association of Cancer Research (AACR)**, 81(13_Supplement), 2240-2240 (2021). doi: 10.1158/1538-7445.AM2021-2240
- [5] **Anand, S.**, Aguet, F., Taylor-Weiner, A., et al. Signature Analyzer: scaling Bayesian NMF to millions of individuals with GPUs. **Broad Institute of MIT & Harvard Retreat**, (2019). GitHub.

INTERESTS

Rass/Garba (**Indian**) **dance:** 5+ years of dancing and choreographing at cultural events (ex. Stanford Holi), national competitions, and family weddings.

Music: 15+ years of classical violin training, performed with Stanford Symphony Orchestra, chamber music groups, and musical theater pit orchestras; also enjoy guitar & ukulele.

Dogs: my wife and I have a 3 year old Mudi dog, Hazel, that we do trick training, frisbee catching, and agility with. She comes with us back-country skiing and watches over us when we climb outdoors.

Ski Mountaineering: ask me about the glacier we climbed up and skied down in the Selkirk Mountains of British Columbia, Canada!

Rock Climbing: we love indoor & outdoor lead climbing + finding new routes along the Pacific Coast. **Running:** causal runner; completed a half-marathon and hoping to work-up to a full marathon soon!