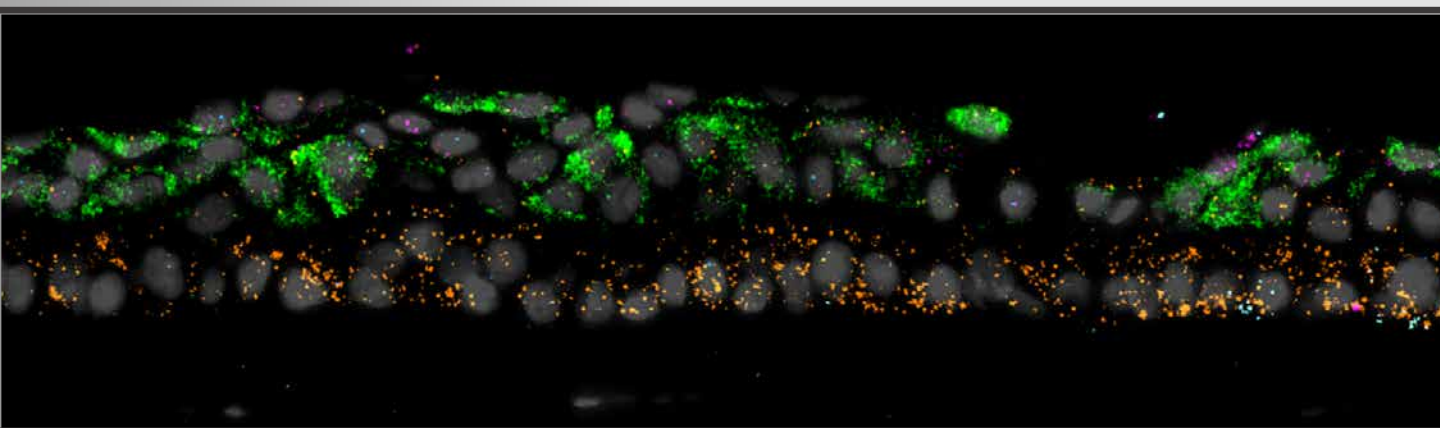


# 2nd Annual GCC Single Cell Omics Symposium



*Oct. 7, 2021*

Gulf Coast Consortia  
QUANTITATIVE BIOMEDICAL SCIENCES





The Gulf Coast Consortia (GCC), located in Houston, Texas, is a dynamic, multi-institution collaboration of basic and translational scientists, researchers, clinicians and students in the quantitative biomedical sciences, who benefit from joint training programs, topic-focused research consortia, shared facilities and equipment, and exchange of scientific knowledge. GCC research consortia gather interested faculty around research foci within the quantitative biomedical sciences, and currently include AI in Healthcare, Antimicrobial Resistance, Cellular and Molecular Biophysics, Innovative Drug Discovery and Development, Immunology, Mental Health, Regenerative Medicine, Single Cell Omics, Theoretical and Computational Neuroscience, Translational Imaging and Translational Pain Research. Working together, GCC member institutions provide a cutting-edge collaborative training environment and research infrastructure beyond the capability of any single institution. GCC training programs currently focus on Biomedical Informatics, Computational Cancer Biology, Molecular Biophysics, Pharmacological Sciences, Precision Environmental Health Sciences and Antimicrobial Resistance. Current members include Baylor College of Medicine, Rice University, University of Houston, The University of Texas Health Science Center at Houston, The University of Texas Medical Branch at Galveston, The University of Texas M. D. Anderson Cancer Center, and the Institute of Biosciences and Technology of Texas A&M Health Science Center.

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# Agenda

- 9:00am **Welcome**
- 9:05-10:00 **Keynote Address**  
Moderator: Kurt Zhang, Texas A&M Univ.
- Generative Modeling for Single Cell Genomics: Tools and an Application for Studying How T Cells Develop in the Thymus*  
**Nir Yosef**, Univ. of California Berkeley
- Session 1: Single Cell in Cancer**  
Moderator: H. Courtney Hodges, Baylor College of Medicine
- 10:00-10:25 *Breast Cancer Evolution Through the Lens of Single Cell Genomics*  
**Nicholas Navin**, MD Anderson Cancer Center
- 10:25-10:50 *Measuring Cytoskeletal Protein Complex Drug Response Variation by Single-Cell Fractionation*  
**Julea Vlassakis**, Rice University
- 10:50-11:15 *Resolved Spatial Transcriptomics of High-Grade Serous Ovarian Carcinoma*  
**Elaine Stur**, MD Anderson Cancer Center
- 11:15-12:00 **Vendor Workshop Session**
- 11:15-11:30 *Harnessing the Power of full-length Transcriptome Analysis for Biomarker Discoveries*  
**Yanli Liu**, Takara Bio
- 11:30-11:45 *Enabling High-Dimensional Biology through Single-Cell Multiomics via the BD Rhapsody™ Platform*  
**Wes Austin**, BD Bioscience
- 11:45-12:00 *Fueling the Century of Biology with Single Cell and Spatial Technologies*  
**Spence Fast**, 10X Genomics
- 12:00-1:30 **Lunch, Poster session, and vendor booths**
- 12:00-12:20 Rapid Fire Presentations:  
*Time Resolved Single Cell Transcriptomic Atlas of Neural Crest Cells in Zebrafish Reveals Lineage-Specific Hox Transcriptional Code*  
**Adam Howard**, Rice Univ. Poster 5
- Tumor and TME Metabolic Reaction Flux Framework from Bulk and Single Cell Gene Expression Data*  
**Yuefan Huang**, Univ. of Texas Health Science Center Houston Poster 6
- Single-nucleus RNA Sequencing Reveals the Doxorubicin-Induced Cognitive Impairment Reversal by HDAC6 Inhibition*  
**Rajasekaran Mahalingam**, MD Anderson Cancer Center Poster 12
- Inquiries at Super-Resolution: Is Genome Organization a Platform for Gene Regulation?*  
**Guy Nir**, Univ. of Texas Medical Branch at Galveston Poster 13

## Agenda

- 12:00-12:50 Vendor booths/breakout rooms
- 12:20-12:50 Lunch
- 12:50-1:30 Poster Session
- 1:30-2:15 **Keynote Address**  
Moderator: Peter McCaffrey, Univ. of Texas Medical Branch at Galveston
- Decoding Decision Making in the Immune System with Single-cell Data*  
**Matt Spitzer**, UCSF & Teiko Bio
- Session 2: Software Tools and Technologies**  
Moderator: Ken Chen, MD Anderson Cancer Center
- 2:20-2:45 *Single Cell Spatial Atlas of the Retina*  
**Rui Chen**, Baylor College of Medicine
- 2:45-3:10 *Spatial Charting of Single Cell Transcriptomes in Tissues*  
**Runmin Wei**, MD Anderson Cancer Center
- 3:10-3:35 *scTenifoldXct: Semi-supervised Manifold Alignment for Inference of Cellular Interactions Through Construction of Intra- and Intercellular Gene Signaling Networks*  
**Yongjian Yang**, Texas A&M Univ.
- Session 3: Single Cell Genomics Applications**  
Moderator: Peter McCaffrey, Univ. of Texas Medical Branch at Galveston
- 3:35-4:00 *Single Cell RNA-seq and Mass Cytometry Reveals a Novel and a Targetable Population of Macrophages in Idiopathic Pulmonary Fibrosis*  
**Ivan Rosas**, Baylor College of Medicine
- 4:00-4:25 *Single-cell Manifold-preserving Feature Selection for Detecting Rare Cell Populations*  
**Shaoheng Liang**, MD Anderson Cancer Center
- 4:25-4:50 *Time-lapse Imaging Microscopy in Nanowell Grids (TIMING™): A Platform to Expand Multi-Dimensional Profiling of Single Cells*  
**Mohsen Fathi**, CellChorus
- 4:50 Closing Remarks  
**H. Courtney Hodges**, Baylor College of Medicine

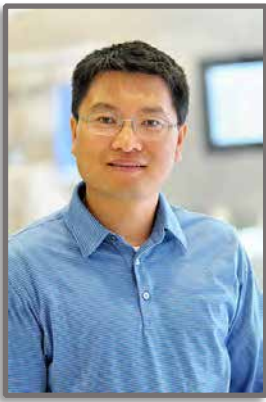
*Symposium Organizers: Kurt Zhang, Ken Chen, Peter McCaffrey, H. Courtney Hodges*



**Wes Austin, PhD**  
**Application Scientist**

*Enabling High-Dimensional Biology through Single-Cell Multiomics  
via the BD Rhapsody™ Platform*

Wes Austin is a single cell multiomics field applications specialist at BD Biosciences. He obtained his PhD in molecular biology from Emory University where he studied the epigenetic regulation of PD-1. Next, he moved to the NIH as a postdoctoral fellow where he focused on the transcriptional and immune repertoire profiling of tissue-like memory B cells following HIV infection. Wes joined BD Biosciences in January 2021, having most recently served as a subject matter expert for Sophia Genetics.



Rui Chen, PhD

Professor

Molecular and Human Genetics

*Single Cell Spatial Atlas of the Retina*

Dr. Chen is currently a professor at the Department of Molecular and Human Genetics at Baylor College of Medicine. Dr. Chen is the director of center of single cell omics and the ATC single cell genomics core. Dr. Chen's research interests fall within the following interactive areas: 1) Identify and functional validate mutations and genes associated with inherited human retinal diseases; 2) Using single-cell multi-omics technology to generate the cell atlas of the human visual system and characterize diseases at the single-cell resolution; 3) Understand the molecular mechanisms of the retinal diseases through characterizing animal disease models and retinal organoids; 4) Develop gene and small molecule therapeutics for retinal degeneration diseases. With a combination of both experimental and computational approaches, Dr. Chen's group focuses on understanding the genetics and genomics of the human visual system function and disease mechanisms.



## Spence Fast Science & Technology Advisor

*Fueling the Century of Biology with Single Cell and Spatial Technologies*

Spence received his master's degree in Forensic and Investigative Genetics from the University of North Texas Health Science Center where he worked on mitochondrial genetic markers in prostate cancer. Afterward, Spence joined the Emerging Technologies Section of the Armed Forces DNA Identification Laboratory at Dover Airforce Base as a Research Scientist. His work focused on recovery and sequencing of highly degraded DNA samples as well as migrating Sanger sequencing methods to NGS platforms for forensic casework. Now Spence focuses his time on science communication and empowering customer research as a Science and Technology Advisor at 10x Genomics.





Mohsen Fathi, PhD

Senior Scientist

*Time-lapse Imaging Microscopy in Nanowell Grids (TIMING™): A Platform to Expand Multi-Dimensional Profiling of Single Cells*

Mohsen Fathi is a Senior Scientist at CellChorus. He is responsible for managing the science team, designing, and executing experiments. Prior to joining CellChorus, he was a Research Assistant in the Single Cell Lab at the University of Houston. Mohsen has six years of experience running TIMING assays including characterization and cytotoxicity screening of CAR T cells and CAR NK cells and characterization of exosomes secretion. Mohsen holds a Ph.D. in Chemical and Biomolecular Engineering from the University of Houston, and a BS from the Sharif University of Technology.



Shaoheng Liang

PhD Candidate

*Manifold-Preserving Feature Selection Helps Find Rare Cell Population Markers and Design Panels*

Shaoheng Liang received his Bachelor's degree from Tsinghua University, Beijing, China, in 2016. He is now a Ph.D. candidate in the Department of Computer Science at Rice University, working in Dr. Ken Chen's computational biology lab at MD Anderson Cancer Center. His work focuses on using machine learning methods to interpret single-cell data.



Yanli Liu, PhD  
Senior R&D Group Leader

*Harnessing the Power of Full-length Transcriptome Analysis for Biomarker Discoveries*

Yanli Liu is a Senior R&D Group Leader at Takara Bio USA. Her group focuses on developing single cell molecular biology assays for Takara Bio's automation platforms. She is an experienced technical leader in product innovation and development and has led several lab studies to success.



Nicholas Navin, PhD  
Professor, Genetics and Bioinformatics  
Director, CPRIT Single Cell Genomics Center  
Co-Director, Sequencing Core  
*Breast Cancer Evolution Through the Lens of Single Cell Genomics*

Dr. Nicholas Navin is a professor in the Department of Genetics and the Department of Bioinformatics and Computational Biology at the MD Anderson Cancer Center. He is the director of the CPRIT 5M Single Cell Genomics Center and the co-director of the Sequencing and Microarray Core Facility. Dr. Navin completed his Ph.D. and postdoctoral studies at the Cold Spring Harbor Laboratory and Stony Brook University. Dr. Navin is internationally recognized for his seminal work on developing single cell DNA sequencing techniques. Dr. Navin developed the first single cell DNA sequencing method (Navin et al. 2011 Nature, citations: 1851) which played a pivotal role in establishing the field of single cell genomics. His research work focuses on applying single cell genomic technologies to understand the evolution of diseases such as cancer, where they have elucidated complex biological processes including invasion, metastasis and therapy resistance. In his previous work, he identified a punctuated model of copy number evolution in breast cancer and discovered that multiple clones co-invade surrounding tissues in premalignant breast cancer. His work has also shown transcriptional reprogramming and adaptive selection of clonal genotypes during chemotherapy resistance in triple-negative disease. Dr. Navin's laboratory is actively developing new genomic technologies for single cell sequencing, plasma DNA and spatial genomics, as well as computational approaches to analyze the resulting large-scale datasets. In recognition for his work, Dr. Navin has been the recipient of many prestigious awards, including the AAAS Wachtel Award, Damon Runyon Innovator Award, ACS Research Scholar Award, Andrew Sabin Fellowship, Wilson Stone Award, Randall Innovator Award, Living Legend Basic Science Award and is a finalist for the Blavatnik Award in Life Sciences.



Ivan O. Rosas, MD  
Professor and Section Chief  
Pulmonary, Critical Care and Sleep Medicine  
Lester and Sue Smith Chair in Lung Health  
*Single Cell RNA-seq and Mass Cytometry Reveals a Novel and a Targetable Population of Macrophages in Idiopathic Pulmonary Fibrosis*

Dr. Rosas' main area of research interest are the prevention, diagnosis and treatment of pulmonary fibrosis, a condition that affects genetically susceptible individuals and the elderly. Clinically his program has focused on defining populations at risk of developing pulmonary fibrosis, identifying disease biomarkers and the design and execution of clinical trials testing novel treatments for pulmonary fibrosis. In the laboratory, his research team employs cutting edge genomic technologies and translational models to determine how select molecular derangements contribute to the development and progression of parenchymal lung disease. The long-term goal of this translational research program is to better understand mechanisms that contribute to disease progression and to inform the development of novel diagnostic and therapeutic strategies for patients affected with fibrotic lung disease.

## Keynote Speaker



Matthew H. Spitzer, PhD

Assistant Professor

Otolaryngology-Head and Neck Surgery and of  
Microbiology & Immunology

*Decoding Decision Making in the Immune System with Single-cell  
Data*

Dr. Spitzer completed graduate training in Immunology at Stanford University in the laboratories of Drs. Edgar Engleman and Garry Nolan. There, he developed experimental and analytical methods to model the state of the immune system and immune responses to cancer using high-dimensional single-cell data. Dr. Spitzer moved to UCSF as a Parker Fellow and a Sandler Faculty Fellow in 2016. He is currently an Assistant Professor in the Departments of Otolaryngology-Head and Neck Surgery and of Microbiology & Immunology as well as an investigator of the Parker Institute for Cancer Immunotherapy and the Chan Zuckerberg Biohub. His research lab uses systems immunology methods including single-cell analysis to understand how the immune system is altered by and mounts responses against cancer.



Elaine Stur, PhD

Postdoc

*Resolved Spatial Transcriptomics of High-Grade Serous Ovarian Carcinoma*

Elaine Stur is a post-doctoral fellow at The University of Texas MD Anderson Cancer Center. She works in the lab of Dr. Anil Sood and her work has been focused on tumor heterogeneity, where she has been driving the single cell and spatial transcriptomics understanding of ovarian tumors. Elaine also studies the immune suppressive mechanisms of ovarian cancer through the identification of possible new drug targets.



**Julea Vlassakis, PhD**

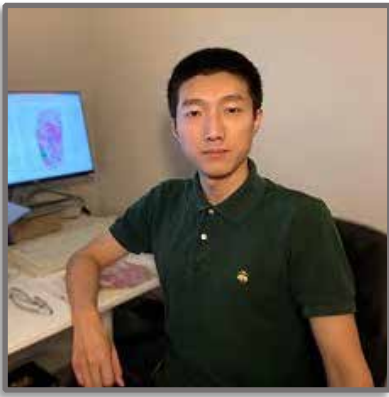
**Assistant Professor**

**Bioengineering**

*Measuring Cytoskeletal Protein Complex Drug Response Variation  
by Single-Cell Fractionation*

Dr. Julea Vlassakis earned her Ph.D. in bioengineering and completed a postdoc in the Herr Lab at UC Berkeley. Her research investigated separation and thermodynamic partitioning phenomena fundamentals to design integrated single-cell protein assays. She joined the Department of Bioengineering at Rice University as an Assistant Professor in July 2021. She directs the Microtechnologies Laboratory for Pediatric Oncology with the goal of advancing targeted and precision therapies for pediatric cancers with a focus on Ewing sarcoma. To study the biochemistry and biophysics of fusion oncoprotein interactions in proliferative and metastatic subpopulations, her group will develop single-molecule and single-cell technologies at the micro and nano scales of cancer biology. Her research has garnered several honors including an NSF Graduate Research Fellowship, Burroughs Wellcome Fund Career Award at the Scientific Interface, and the CPRIT Scholar Award.





Runmin Wei, PhD  
Postdoc Research Fellow  
*Spatial Charting of Single Cell Transcriptomes in Tissues*

Dr. Runmin Wei is a Damon Runyon post-doctoral research fellow from Navin lab in MD Anderson Cancer Center. He earned his bachelor's degree in pharmaceutical engineering and MS degree in pharmacology in China. He got his PhD degree from University of Hawaii Cancer Center with focusing on bioinformatics in metabolomics and metagenomics. He is also interested in machine learning and deep learning biomedical studies. He joined Navin Lab in MD Anderson in 2019. His study focuses on using single-cell and spatial sequencing technology to understand the intra-tumoral heterogeneity and tumor microenvironment in breast cancer.



Yongjian Yang

PhD Student

Electrical and Computer Engineering

*scTenifoldXct: Semi-supervised Manifold Alignment for Inference of Cellular Interactions Through Construction of Intra- and Intercellular Gene Signaling Networks*

Yongjian is a Ph.D. student from the Department of Electrical and Computer Engineering, Texas A&M University. Currently, he is working at Dr. James Cai's group, where they are studying the genetic basis of phenotypic variability and developing computational tools to identify genetic variants that dominate complex traits. Before returning to graduate school, Yongjian was employed by an IN-VITRO DIAGNOSTICS company in Japan developing healthcare applications.

## Keynote Speaker



Nir Yosef, PhD  
Associate Professor  
Computer Science

*Generative Modeling for Single Cell Genomics: Tools and an Application for Studying How T Cells Develop in the Thymus*

Nir Yosef received his Ph.D. in Computer Science from Tel Aviv University and then completed a postdoctoral training at the Broad Institute, where he worked on transcriptional regulation of T cell differentiation. Nir joined the faculty at UC Berkeley in 2014, where he is now an Associate Professor of Computer Science, a core member at the Center of Computational Biology, and a Chan Zuckerberg Biohub investigator. The Yosef lab is developing data-centric methods for studying how changes in transcription are associated with various phenotypes in the immune system. In that capacity, the lab is developing and applying computational tools that leverage single cell genomics, with the goal of better understanding the factors that contribute to variability between cells, (e.g, metabolism, chromatin structure) and their broader implications (e.g., in autoimmunity). A second area of research is method development for studying regulatory regions in the genome, based on chromatin profiles and massively parallel reporter assays.

<b>First Name</b>	<b>Last Name</b>	<b>institution</b>	<b>Abstract Title</b>	<b>Poster #</b>
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Xuesen	Cheng	BCM	<i>Single-nuclei RNA-seq Provides Comprehensive Transcriptomic Classification of Human Retinal Cell Types</i>	2
Jinzhuang	Dou	MDA	<i>Bi-order integration of single-cell and spatial transcriptomics data with partially overlapping features</i>	3
Ishwar	Hosamani	BCM	<i>Transcriptional Profiling of Reprogrammed Cochlear Cells with Ectopic Induction of Atoh1, Gfi1, Pou4f3</i>	4
Adam	Howard	RU	<i>Time Resolved Single Cell Transcriptomic Atlas of Neural Crest Cells in Zebrafish Reveals Lineage-Specific Hox Transcriptional Code</i>	5
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Jiangyuan	Li	TAMU	<i>MMD Based Gaussian Mixture Variational Auto-encoder for Integrating Single-cell Gene Expression Data</i>	8
Jin	Li	BCM	<i>Unified Cell-Type Transcriptomic Reference Of Mouse Retina</i>	9
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Fei	Liu	TAMU	<i>Single Cell RNA-seq Reveals Resident Macrophages as A Therapeutic Target to Restore Salivary Gland Function Impaired by Radiotherapy</i>	11
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***scTenifoldKnk: An Efficient Virtual Knockout Tool for Gene Function Predictions Via Single-cell gene Regulatory Network Perturbation***

Osorio D<sup>1</sup>, Zhong Y<sup>2</sup>, Li G<sup>2</sup>, Xu Q<sup>1</sup>, Yang Y<sup>3</sup>, Tian Y<sup>4</sup>, Chapkin RS<sup>5</sup>, Huang JZ<sup>2</sup>, Cai JJ<sup>1,3,6,\*</sup>

<sup>1</sup>Department of Veterinary Integrative Biosciences, <sup>2</sup>Department of Statistics, <sup>3</sup>Department of Electrical and Computer Engineering, <sup>4</sup>Department of Veterinary Physiology and Pharmacology,

<sup>5</sup>Department of Nutrition, <sup>6</sup>Interdisciplinary Program of Genetics, Texas A&M University, College Station, TX 77843, USA

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**Background:** Gene knockout (KO) experiments are a proven approach for studying gene function. A typical KO experiment usually involves the phenotypic characterization of KO organisms. The recent advent of single-cell technology has greatly boosted the resolution of cellular phenotyping. Applications of single-cell technology in KO experiments hold promises for providing unprecedented insights into gene functions. However, the large-scale application of single-cell technology in systematic KO experiments is prohibitive due to the vast resources required.

**Hypothesis/Goals:** We develop scTenifoldKnk, an efficient software tool that uses single-cell RNA sequencing (scRNA-seq) data to perform virtual KO. It can be used to predict gene function, achieving the goal of real-animal gene KO experiments.

**Methods:** In a scTenifoldKnk virtual KO analysis, a single-cell gene regulatory network (scGRN) is first constructed from the scRNA-seq data of the wild-type (WT) samples. Then, a target gene is knocked out from the adjacency matrix of constructed scGRN by setting weights of the gene's outward edges to zeros. This "pseudo-KO" scGRN is compared with the original WT scGRN to identify significantly differentially regulated (DR) genes. We call these DR genes virtual-KO perturbed genes, which are used to infer functions of the KO gene in analyzed cells.

**Results:** Using existing data sets, we demonstrate that the scTenifoldKnk-based virtual KO analysis recapitulates the main findings of real-animal KO experiments and recovers the expected functions of causal genes of Mendelian diseases in relevant cell types. Finally, we demonstrate the use of scTenifoldKnk to perform systematic KO analysis, in which a large number of genes are individually deleted, or a single gene is deleted in many tissues and cell types.

**Conclusions:** scTenifoldKnk is an efficient virtual KO tool for predicting gene function via scGRN perturbation. It can be used to prioritize targets and predict outcomes prior to real-animal KO experiments, as well as to conduct systematic KO to predict the functions of all genes.

**Acknowledgments:** This research was funded by Texas A&M University 2019 X-Grants and the DoD grant GW200026 for J.J.C.

***Single-nuclei RNA-seq Provides Comprehensive Transcriptomic Classification of Human Retinal Cell Types***

Cheng X<sup>1</sup>; Liang Q<sup>1,2</sup>; Owen LA.<sup>3</sup>; Shakoor A<sup>3</sup>; Vitale AT<sup>3</sup>; Kim IK<sup>3</sup>; Morgan DJ<sup>3,4</sup>; Li Y<sup>1</sup>; DeAngelis MM.<sup>3</sup>; Chen R<sup>1,2</sup>

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2.Verna and Marrs McLean Department of Biochemistry and Molecular Biology, Baylor College of Medicine, Houston, TX, United States.

3.Department of Ophthalmology and Visual Sciences, University of Utah, Salt Lake City, UT, United States.

4.Department of Pharmacotherapy, the College of Pharmacy, University of Utah, Salt Lake City, UT, United States.

**Corresponding author: Rui Chen, HGSC, Molecular and Human Genetics, One Baylor Plaza, Houston, TX, USA. E-mail: ruichen@bcm.edu.**

**Background:** The human retina is composed of many different neuronal and non-neuronal cell types, with their fraction in the tissue varying dramatically, ranging from 75% to less than 0.5%. Significant cell heterogeneity is observed within many retinal cell types. However, the number of cell subtypes and their molecular signature remain unknown.

**Goals:** Our study aims at generating the first version of human retinal cell atlas reference by characterizing the transcriptome and open chromatin profile for all cell types in the human retina.

**Methods:** Single-nuclei RNA-seq and single-nuclei ATAC-seq are carried out to profile healthy human retina from six individual donors using the 10x Genomics technologies. Each donor retina is dissected into three areas: the fovea, macula, and peripheral retina. A fractionation protocol was developed to enrich nuclei from rare neuron types, such as bipolar cells, amacrine cells, and retinal ganglion cells. Integrative data analysis is performed to identify cell subtypes, marker genes, chromatin signature, and transcription factors and modules. RNA *in situ* hybridization is performed to validate novel cell populations.

**Results:** A transcriptome profile is generated for over 300K nuclei, leading to the identification of over 70 cell types in the retina. Notably, the numbers of bipolar cell clusters (13) and amacrine cell clusters (39) both exceeded the previously reported primate and human studies. Through integration of the single-nuclei RNA-seq and single-nuclei ATAC-seq data, key transcription factors and transcription modules were identified at both major- and sub- cell-type level. Moreover, three-way comparison among mouse, monkey and human retina single-cell transcriptomic data revealed conserved and lineage specific cell types during evolution. Finally, it has been observed that genes associated with different human retina diseases show distinct cell type specific gene expression profiles, providing insight to potential disease mechanisms at cell subtype resolution.

**Conclusions:** The study represents the most comprehensive single-cell transcriptome and single-cell chromatin accessibility profiling for the human retina to date. Over 300K single nuclei are profiled and over 70 types of cells are identified, making it a high-quality dataset that can serve as the first version of a human retina cell atlas reference.

**Acknowledgements:** This work is supported by Cell Atlas of the Neural Retina Seed Networks, CZF2019-002425, Chan Zuckerberg Foundation.

***Bi-order Integration of Single-Cell and Spatial Transcriptomics Data with Partially Overlapping Features***

Dou J<sup>1</sup>, Liang S<sup>1</sup>, Liang Q<sup>2</sup>, Choi J<sup>2</sup>, Li J<sup>2</sup>, Hu M<sup>3</sup>, Jiang X<sup>3</sup>, Chen R<sup>2</sup>, Chen K<sup>1</sup>

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2. Department of Molecular and Human Genetics, Baylor College of Medicine, Houston, TX, 77030, USA
3. Department of Neuroscience, Baylor College of Medicine, Houston, TX, 77030, USA

Corresponding authors: Ken Chen. Email [kchen3@mdanderson.org](mailto:kchen3@mdanderson.org)

**Background**

Charting a biological atlas of an organ, such as the brain, requires us to spatially resolve whole transcriptomes of single cells. Single-cell RNA-Seq (scRNA-seq) can measure transcriptomes comprehensively but lose spatial localization information of cells within organs. Image-based transcriptomic approaches, for example multiplexed error-robust fluorescence in situ hybridization (MERFISH), provide powerful means to measure both expression levels and locations of RNAs at single-cell resolution. However, they are limited in a subset of targeted genes, which impedes profiling of the whole transcriptome.

**Goals**

Here, we devise bindSC, a tool that reconstructs a genome-wide spatial map at single-cell resolution by integrating scRNA-seq and image-based spatial data collected from the same region. The key advance of bindSC is that it achieves *de novo* alignment of both the rows and the columns of two different data matrices. This addresses the limitation of previous methods that are constrained to the subset of features shared by the two data matrices.

**Methods**

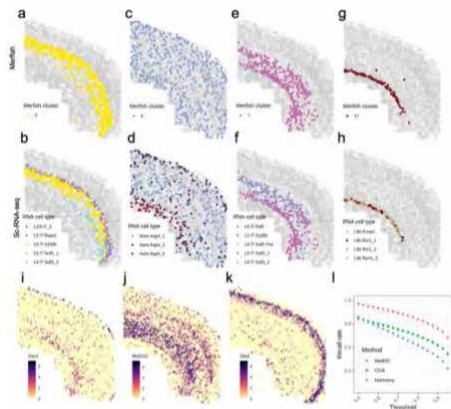
BindSC employs the bi-order canonical correlation analysis (bi-CCA) which introduces  $\mathbf{Z}$  (transcriptomics matrix on targeted gene panel) to link  $\mathbf{X}$  (spatial transcriptomics matrix on targeted gene panel) and  $\mathbf{Y}$  (transcriptomics matrix on full gene panel). Bi-CCA iteratively updates  $\mathbf{Z}$  to find an optimal solution which maximizes the correlation between  $\mathbf{X}$  and  $\mathbf{Z}$  and between  $\mathbf{Y}$  and  $\mathbf{Z}$  in the latent space simultaneously. Based on the integration, bindSC then transfers cell types annotated in scRNA-seq data onto matched spatial transcriptomics data.

**Results/Conclusions**

We demonstrate that incorporating unshared genes significantly improves the integration of scRNA-seq and MERFISH data on mouse brain data. bindSC improves the percentage of annotated MERFISH cells from ~55% to 80% with maximal probability on cell type assignment being 0.9 (**Fig.1 I**). Our integration provides higher resolution on cell type annotation compared with that from MERFISH data only (**Fig.1 a-h**), especially for rare cell type annotation. The reconstructed genome-wide spatial map can thus reveal spatial gene expression patterning beyond the limitations of current spatial transcriptomics technologies (**Fig. 1 i-k**).

**Acknowledgements**

This project has been made possible in part by the Human Cell Atlas Seeds Network Grant CZF2019-02425 to RC and KC.



### Fig.1 Integration of single-cell and spatial transcriptomics using bindSC.

We applied bindSC to integrate MERFISH (Zhang *et al.*, 2020) and scRNA-seq data (Yao *et al.*, 2020) in the mouse primary motor cortex (MOp) region. **a-h**: Improvement of cell type annotation by projecting scRNA-seq cell types on spatial map. The panel **a**, **c**, **e**, **g** shows spatial distribution of four clusters (5,6,7,17) determined by MERFISH in one of the coronal slices. Each column denotes one cluster. The panel **b**, **d**, **f**, **h** show spatial distribution of scRNA-seq cell types based on bindSC label transfer. The cells are the same with the top but colored with scRNA-seq cell types. These MERFISH clusters are composed of multiple scRNA-seq cell types. **i-k**: Imputation of spatial gene expression for genes not included in MERFISH panel. Three

example genes are shown with *Osr1* (**i**), *Rnf152*(**j**), and *Otof* (**k**). The darker color denotes higher expression level. **l**: Comparison of label transfer on three methods. We integrated two modalities using bindSC, CCA, and Harmony and then used Support Vector Machine (SVM) to perform label transfer for each method. The x-axis denotes the maximal prediction probability on assigning cell type for SVM. The y-axis denotes the proportion of MERFISH cells that are annotated with scRNA-seq cell types.

Zhang M, Eichhorn S W, Zingg B, et al. Molecular, spatial and projection diversity of neurons in primary motor cortex revealed by in situ single-cell transcriptomics[J]. Biorxiv, 2020.

Yao Z, Liu H, Xie F, et al. An integrated transcriptomic and epigenomic atlas of mouse primary motor cortex cell types[J]. Biorxiv, 2020.



***Transcriptional Profiling of Reprogrammed Cochlear Cells with Ectopic Induction of Atoh1, Gfi1, Pou4f3***

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**Background**

Sensory hair cells of the cochlea function as transducers of sound energy into electrical impulses which are then transmitted to the brain. Mammalian hair cells can be killed by exposure to loud sounds, certain antibiotics and chemotherapy drugs, as well as aging, which is one of the major causes of hearing loss. Once lost, mammalian cochlear hair cells do not regenerate. However, regeneration of hair cells has been observed in non-mammals, and research towards replicating this phenomenon in mammals has been actively pursued for over 20 years. Reprogramming of supporting cells of the cochlea into hair cells by inducing ectopic hair cell transcription factors has emerged as one of the top methods to achieve hair cell regeneration.

**Hypothesis**

The ectopic expression of transcription factors Atoh1, Gfi1 and Pou4f3 can reprogram supporting cells in to hair cells.

**Methods**

In order to reprogram supporting cells to hair cells, we used Sox9CreER mice, which drive recombination in supporting cells of the cochlea. We bred these mice with mice carrying a Cre-inducible tdTomato reporter gene targeted to one allele of the *ROSA26* locus, and a second modified *ROSA26* allele in which Atoh1 alone, or combination of Atoh1-Gfi1 or Atoh1-Gfi1-Pou4f3 transcription factors could be expressed in a Cre-inducible manner. Ectopic expression of these transcription factors was triggered by tamoxifen injection at P1 and tdTomato+ cells were FACS sorted at P8 and profiled by single cell RNA sequencing using the 10X Genomics Chromium V3 kit. The resulting data were aligned with the mm10 mouse reference genome and further analysis was performed with the Seurat R package. Briefly, after appropriate filtering of each of the datasets to remove low quality cells with low number of counts and any potential doublets with very high counts, the data were log normalized and the top 2000 variable genes in each dataset were identified. Next, an integrated analysis was performed to identify clusters that differed among the various genotypes and the clusters were classified into appropriate cell types based on their marker gene expression.

**Results and Conclusions**

While we did not see any hair cell gene expressing clusters in the control (Sox9CreER x Ai9 reporter only) dataset, we were able to identify new clusters that expressed hair cell genes in the transcription factor induced datasets. We also saw a new population of supporting cells with similar transcriptional signature in all the induced datasets. The results of the single cell analysis reflected prior immunofluorescence experimental observations and serves as a good validation for the cellular reprogramming of the supporting cells in the inner ear.

**Acknowledgements:**

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***Time Resolved Single Cell Transcriptomic Atlas of Neural Crest Cells in Zebrafish Reveals Lineage-Specific Hox Transcriptional Code***

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**Background:** Neural crest cells (NCCs) are a highly migratory, multipotent, and transient stem cell population essential to vertebrate development. Born along the neural tube at early developmental stages, NCCs are regionally specified along the anterior-posterior axis to contribute to a vast number of cell lineages, such as craniofacial cartilage, pigment cells, and large tracts of the peripheral nervous system. In our recently published analysis of posterior zebrafish NCC, we discovered an emerging combinatorial expression code of transcripts that encode for Hox transcription factors, which was specific to NCC-derived neural lineages. A Hox expression code has been characterized within the cranial NCC, but prior to had not been observed within the context of the posterior neural NCC lineages. Importantly, the combinatorial while code persisted throughout the embryonic-to-larval transition, it remained unclear if this code persisted in NCC at other developmental stages. A comprehensive description of the combinatorial changes of Hox expression in NCC will greatly contribute to our understanding of posterior NCC specification, fate acquisition, and differentiation.

**Goals:** The goal of this study is to map the expression in combination of Hox transcription factors across several posterior NCC lineages over time.

**Methods:** Several published single cell RNA transcriptomic (scRNA-seq) studies characterizing FACS-sorted NCC and NCC-derived cells were computationally merged using the Seurat (v3.1.1) integration pipeline in Rstudio (v3.6.3). Data was sourced from NCBI GEO database to include the following datasets: 24 hours post fertilization (GSE163907), 48-50 hpf (GSE152906), 68-70 hpf (GSE152906), 5 days post fertilization (GSE131136), Juvenile (GSE131136), and adult tissues (GSE131136). All datasets were reprocessed to standardize cell thresholds and labeled with slight modification according to the original publications for consistency.

**Results:** Integration of datasets produced a cohesive and expected distribution of cell identities, as noted by cells from separate temporal stages constellating proximally to presumptively more differentiated cells from older stages. Throughout this comprehensive transcriptomic atlas, Hox Transcriptional codes were observed in several NCC-lineages in every dataset analyzed, but was particularly robust in datasets from 48 hpf through adult lineages. Discrete lineages were detected for neural tissues, particularly the enteric nervous system.

**Conclusions:** The generation of a multi-stage comprehensive transcriptional atlas from multiple scRNA-seq studies will serve as a valuable tool for the NCC zebrafish community. Additionally, this atlas of cell lineages demonstrates the complexity and robustness of combinatorial Hox expression codes in posterior NCC throughout development.

**Acknowledgements:** A special thanks goes to the members of the Uribe Lab who have supported this project. Additional thanks goes to Dr. Ezra Lencer for providing digital resources from their recent publication. Funding for this project was provided by Rice University, Cancer Prevention & Research Institute of Texas (CPRIT) Recruitment of First-Time Tenure Track Faculty Members (CPRIT-RR170062) and the NSF CAREER Award (1942019) awarded to R.A.U.

***Tumor and TME Metabolic Reaction Flux Framework from Bulk and Single Cell Gene Expression Data***

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**Background:** The metabolic reprogramming in both TME (Tumor Microenvironment) and tumor has been considered a hallmark of cancer because tumor cells often alter metabolic strategies under nutrient-deprived conditions to support their growth and survival. The TME, including immune cells, cancer-associated fibroblast, stromal cells, is acidic, hypoxic, and nutrient-deficient. As a result, tumor cells either compete or cooperate for nutrients with other cell types to sustain tumor proliferation. A fundamental interest in cancer research is to understand the underlying mechanisms of those altered activities in tumors and TME and explore potential rational metabolic therapeutical targeting.

**Goals:** However, our understanding of metabolic competition and cooperation in TME is still limited. RNA-seq and scRNA-seq datasets provide unprecedented resolution of tumor inter- and intra-heterogeneity, but its use in understanding metabolic activities is still lacking.

**Methods:** To fill this gap, we developed a computational framework to infer the global metabolic reaction network from RNA-seq and scRNA-seq data. Our method utilized FBA (Flux Balance Analysis) coupled with quadratic programming to estimate 13,082 metabolic reaction fluxes. We then employed a graph-based approach to summarize the biochemical reaction fluxes into individual pathways activity scores.

**Results:** We validated our predicted fluxes using NCI-60 experimental exchange flux data. Through further application on TCGA data, we accurately validated the key metabolic difference in oxidative and glycolytic tumors. In addition, we discovered a novel metabolic reaction associated with hypoxia. We also applied our method on public single-cell data and observed a dynamic, metabolic interaction between tumor and immune cells under different TME compositions. Our high-resolution metabolic networks can significantly facilitate downstream analysis and generate dynamic metabolic interaction TME profiles beyond what the current methods can provide.

**Acknowledgement:** This project has been made possible by MD Anderson Moon shots program.

***Ectopic Expression of CHAF1A in the Neural Crest Blocks Neuronal Differentiation in Zebrafish***

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**Background:** Neural Crest Cells (NCC) are a transitory multipotent stem cell population, present during vertebrate embryogenesis, that migrate to distinct sites within the developing embryo and give rise to a variety of cell types, including neurons and glia of the sympathetic nervous system. CHAF1A, a member of the chromatin assembly factor (CAF-1), is required for development in the early embryo, however its roles during vertebrate neuronal development are not well known. In humans, CHAF1A is highly expressed in neuroblastoma (NB), a neural crest-derived pediatric cancer, suggesting it may be involved in the neural crest to neuroblastoma transformation.

**Hypothesis/Goals:** In an effort to gain insight into CHAF1A's role in NB progression, our goal was to test the hypothesis that CHAF1A blocks NCC differentiation towards a neuronal fate *in vivo*.

**Methods:** By leveraging recent single cell RNA-seq datasets from NCC and NCC-derived cells in the vertebrate model zebrafish, as well Hybridization Chain Reaction (HCR), we examined the spatiotemporal expression of *chaf1a* during NCC development and during early and late neuronal differentiation. Additionally, we generated constructs for overexpression of human CHAF1A in the NCC lineage and *in vivo* performed clonal analysis, after injection into zebrafish embryos, to quantify changes in neuronal differentiation.

**Results:** We discovered that zebrafish *chaf1a* is strongly expressed in the NCC pre-migratory population and during early NCC migration phases. During later phases of development, we found that *chaf1a* drastically decreased in NCC-derived cells undergoing neuronal differentiation, suggesting that its exclusion is necessary for neuron differentiation. Indeed, ectopic expression of human CHAF1A in zebrafish NCC lineage was sufficient to prevent neuronal differentiation *in vivo*.

**Conclusions:** These data show that *chaf1a* is expressed during early neural crest development, but its expression is rapidly lost in cells undergoing neuronal differentiation, and increased CHAF1A in NCC blocks neuronal differentiation. Overall, this project increases our understanding of CHAF1A and sheds light on its potential role during neural crest differentiation and NB oncogenesis.

**Acknowledgements:** Funding for this project provided by Cancer Prevention & Research Institute of Texas grant RR170062 and the American Cancer Society RSG-19-107-01.

***MMD Based Gaussian Mixture Variational Auto-encoder for Integrating Single-cell Gene Expression Data***

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**Background:** Single-cell RNA sequencing is revolutionizing biomedical research by revealing molecular variations at a cellular resolution. A number of statistical and computational methods have been proposed to process and analyze data from a single experiment. Deep learning method, particular variational auto-encoder (VAE) has been proven a powerful tool in learning latent representations of gene expression patterns, which facilitates downstream analysis, such as visualization, clustering, and differential expression. However, it remains a major challenge to perform integrative analysis of single cell data across different datasets.

**Methods:** We developed a neural network based Gaussian mixture VAE for single-cell analysis, which learned latent representation of each cell and achieved optimal clustering of cells by their physiological types. Furthermore, with a robust incorporation of maximum mean discrepancy (MMD) regularization, the model automatically minimized the batch effects across multiple datasets and regenerated normalized gene expression data for subsequent statistical analysis.

**Results:** We demonstrated the effectiveness of our model for dimension reduction and clustering on various settings of simulated data as well as real data (PBMC). The effectiveness of our model on batch correction is observed on a diverse set of real data with emphasis on liver data.

**Acknowledgements:** This study was supported by NIH grant 1R01DK112368-01 and AHA grant 15GRANT25700195 for K.K.Z.

## ***Unified Cell-Type Transcriptomic Reference of Mouse Retina***

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### **Background**

Single cell RNA sequencing (scRNA-Seq) has advanced the assessment of cellular heterogeneity level at the single cell resolution by transcriptional similarities and differences. Data resources of scRNA-Seq have been largely produced and extensively studied for mouse retina. These data resources form a powerful tool to study cellular components, transcriptome relationships, and regulatory mechanisms underlying various retinal diseases and biological processes.

### **Goals**

The large volume of mouse retinal scRNA-Seq data have been released in separate repositories, restricting them from wide-use in mouse retina communities. In this work, we are presenting a unified cell-type reference for wild-type mouse retina using our generated single-cell/nucleus RNA-Seq experiments complementing publicly available samples. This unified reference serves an easy-to-use data resource of mouse retina for mouse retina communities.

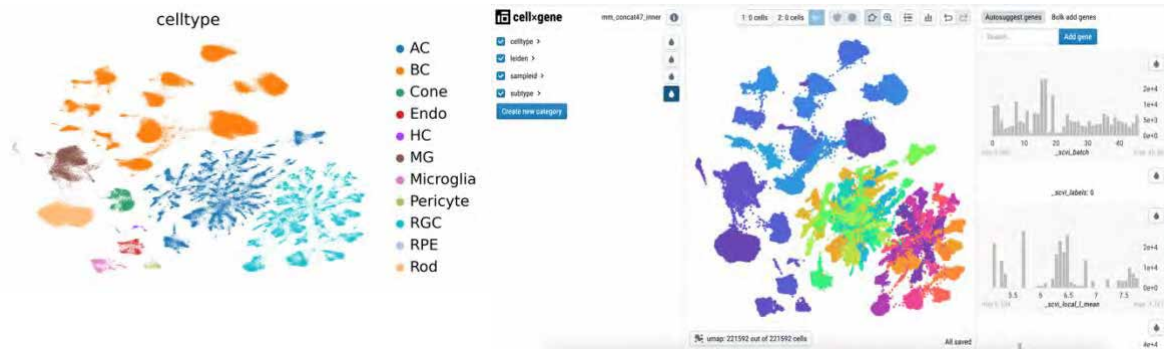
### **Methods**

To achieve the most comprehensive mouse retina cells, we produced extensive single-cell/neucli RNA-Seq cells from our in-house wild-type mouse samples. By incorporating publicly available yet separate hosted samples, we have collected the most comprehensive single cells for mouse retina. These collected single cells undergo integration after removing sample effects using scVI <sup>1</sup>. The low-dimensional representations of integrated cells are used to measure cell similarities and cell clustering by Leiden algorithm. Major cell types are annotated by matching publicly annotated cells and major cell marker genes. Subtypes of amacrine cells (ACs), bipolar cells (BPs), and retinal ganglion cells (RGCs) are generated by sub-clustering and annotation on major type specific cells. Annotated major cell types and subtypes form a unified reference of mouse retina. To facilitate the public use of the reference, we deposit the reference at cellxgene <sup>2</sup> for visualization and gene signature inspection. Pretrained classifiers using scPred <sup>3</sup> are also released to annotate new mouse retinal cells.

### **Results and conclusions**

We have collected over 220,000 mouse retinal cells from in-house experiments and public samples. These a quarter million cells formed 11 major cell types and over 100 subtypes (**Figure 1A**). To facilitate the public use, our reference has been deposited at cellxgene for visualization and inspection of gene signatures (**Figure 1B**). Pretrained classifiers are shared in public URL for annotating incoming new mouse retina cells. This universal reference facilitates the single-cell studies of mouse retina.

### **Acknowledgements**



**Figure 1. Unified reference of mouse retina.**

(A) Annotated cell types of mouse retina. (B) Visualization of the reference at cellxgene.

**Reference:**

- 1 Lopez, R., Regier, J., Cole, M. B., Jordan, M. I. & Yosef, N. Deep generative modeling for single-cell transcriptomics. *Nature Methods* **15**, 1053-1058, doi:10.1038/s41592-018-0229-2 (2018).
- 2 Megill, C. *et al.* cellxgene: a performant, scalable exploration platform for high dimensional sparse matrices. *bioRxiv*, 2021.2004.2005.438318, doi:10.1101/2021.04.05.438318 (2021).
- 3 Alquicira-Hernandez, J., Sathe, A., Ji, H. P., Nguyen, Q. & Powell, J. E. scPred: accurate supervised method for cell-type classification from single-cell RNA-seq data. *Genome Biol* **20**, 264, doi:10.1186/s13059-019-1862-5 (2019).

***Integrative Analysis on Single-cell Multi-omics Data of Adult Human Retina***

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**Abstract**

**Background.** Cell types in the human retina are highly heterogeneous with their abundance varies by several orders of magnitude and is functionally required for the human visual system. However, a complete map of the human retinal cell types is lacking and moreover, the gene regulation network behind it is largely unrevealed.

**Hypothesis.** We hypothesize that a large portion of the heterogeneity of the transcriptome of retinal cells are originated from their diverse chromatin landscape.

**Methods.** To decipher the complexity, we generated a multi-omics single-cell atlas of the adult human retina including over 250K nuclei for single-nuclei RNA-seq and 150K nuclei for single-nuclei ATAC-seq. To balance the number of cells from abundant and rare cell types, we performed antibody-based nuclei sorting to enrich rare cells, mainly amacrine cells and retinal ganglion cells.

**Results.** We were able to integrate the snATAC-seq data to snRNA-seq data, generating a chromatin accessibility atlas for over 50 retinal cell types. We identified 70k distal cis-element-gene pairs for over 11k genes, with a majority of them being cell type specific. In addition, our distal cis-element list had a significant enrichment of previously discovered elements from bulk sequencing studies and showed improvement in the interpretability of the element.

**Conclusion.** Taken together, this new dataset represents the most comprehensive single-cell multi-omics profiling for the human retina that enables in-depth molecular characterization of most cell subtypes.

**Acknowledgements.** We thank the Human Cell Atlas Seed Network Grant CZF2019-02425 to RC for supporting this study.



***Single Cell RNA-seq Reveals Resident Macrophages as a Therapeutic Target to Restore Salivary Gland Function Impaired by Radiotherapy***

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**Background.** Salivary gland (SG) destruction is a major adverse effect of radiotherapy for head and neck cancer. Consequent dry mouth severely compromises quality of life and is difficult to remedy. My laboratory found that the transient activation of Hedgehog signaling pathway after radiation rescued salivary function (Hai et al., 2014; 2016; 2018), but the exact mechanisms remain unclear.

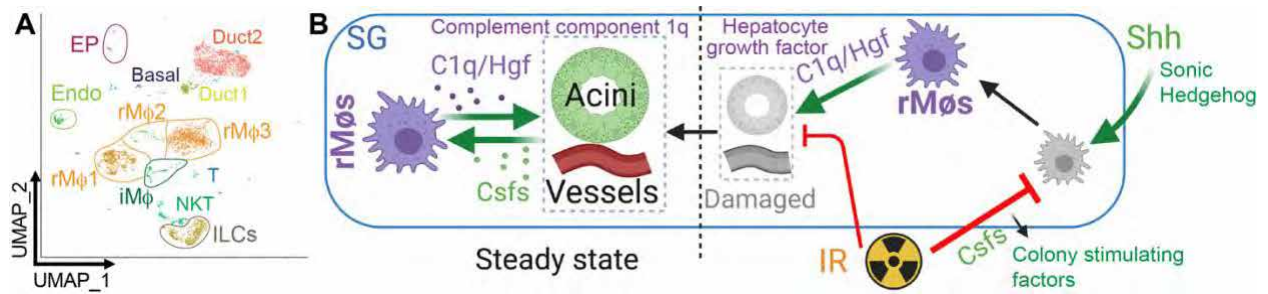
**Goals.** Determine SG cells directly responsive to Hedgehog activation and their roles in the rescue of SG function damaged by radiation.

**Methods.** Mouse SGs were not treated or transferred with control GFP gene or Sonic Hedgehog (Shh) gene, and then collected at 7 days later for single cell RNA sequencing with 10x Chromium platform (10x Genomics). Data were analyzed with Cell Ranger, R package scater, and Seurat, and visualized with the Uniform Approximation and Projection (UMAP) method. Findings were verified by lineage tracing in mouse models and qRT-PCR and ELISA of SG cells isolated with FACS.

**Results.** In non-treated SGs, resident macrophages (rMφs) are abundant and interact with epithelial progenitors (EP) and endothelial cells (Endo) through paracrine homeostatic factors such as C1q, Hgf and Csf1/2. SG rMφs are the major type of cells expressing key membrane mediators of Hedgehog signaling, while lineage tracing confirmed that Mφs are major Hedgehog-responsive cells in SGs. Intra-SG transfer of Shh but not GFP gene greatly enhanced the paracrine homeostatic interaction between rMφs with other SG cells. SG rMφs are also the major type of cells expressing the oxidative stress sensor Trpm2 that causes cell death in response to radiation. Consistently, SG rMφs are severely damaged by radiation, restored by Hedgehog activation, and required for the restoration of salivary function by Hedgehog activation following radiation.

**Conclusions.** SG rMφs are a promising therapeutic target to restore salivary function impaired by radiotherapy, while single cell RNA sequencing is a powerful approach to determine roles of cell subsets such as rMφs during tissue regeneration.

**Acknowledgements.** This study is funded by NIH 1R01DE022975. We sincerely thank Drs. Andrew Hillhouse and Kranti Konganti in TAMU Genomics Core for scRNA-seq.



A: Cell clusters identified in NT SGs with scRNA-seq. iMφs: infiltrating macrophages, ILCs: innate lymphoid cells, Basal: basal/myo-epithelial cells.

B: Scheme of paracrine homeostatic interaction between SG rMφs and other cells and the potential of modulating rMφs for restoring salivary function impaired by radiotherapy.

***Single-nucleus RNA Sequencing Reveals the Doxorubicin-Induced Cognitive Impairment Reversal by HDAC6 Inhibition***

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**Background:** Doxorubicin (DOX) is a highly effective chemotherapy used to treat breast cancer. Unfortunately, up to 60% of survivors report chemotherapy-induced cognitive impairment (CICI) characterized by deficits in working memory, processing speed and executive functioning. Recent reports show the promising effect of histone deacetylase 6 (HDAC6) inhibition on treating cognitive impairment in neurodegenerative disorders. We recently demonstrated that the ACY-1083, an HDAC6 inhibitor, successfully reversed cognitive impairment in a cisplatin-induced model of CICI.

**Hypothesis/Goals:** In this study, we hypothesize that HDAC6 inhibition by ACY-1083 can reverse DOX-induced cognitive impairment. We explored transcriptomics changes using single-nucleus RNA sequencing (snRNA-seq).

**Methods:** Mice were treated with doxorubicin HCL (5 mg/kg/week, Pfizer, New York, NY) or PBS intraperitoneally for 4 weeks, followed by 1 week of rest. Mice were then treated with the blood-brain barrier permeable HDAC6 inhibitor ACY-1083 (10 mg/kg/day, Regenacy Pharmaceuticals, Waltham, MA) or vehicle intraperitoneally daily for 2 weeks. The nuclei from the mouse hippocampus were isolated. The 10x Genomics Chromium Next GEM 3' Single Cell Reagent kits v3.1 was used for the library preparation and sequencing was done with Illumina NovaSeq 6000. The sequencing data were processed with Cell Ranger (version 6.0). All the downstream analysis was performed with the Seurat package.

**Results:** The integrated analysis of control, DOX, and DOX+ACY treated samples revealed 11 cell types. The pathway analysis indicated that DOX treatment affected genes related to mitochondrial function. The analysis of the microglia population showed an increase in neurodegeneration-associated genes and loss of microglia homeostasis genes that suggest a neurodegenerative microglia phenotype closely resembling stage 1 disease-associated microglia (DAMs). In the dentate gyrus (DG) neuron population, HDAC6 inhibition enriched a sub-cluster that express genes related to neuronal development and synaptogenesis. Similarly, HDAC6 inhibition increased the mature oligodendrocyte population. Behavioral testing confirmed that ACY-1083 reversed CICI. Overall, transcriptomics changes in the multiple cell types and the enrichment of a subpopulation expressing genes related to neuronal development and synaptogenesis could be the mechanism for reversing the cognitive impairment in our CICI mouse model.

**Conclusions:** The snRNA-seq reveals changes in gene expression in specific cell populations including microglia, oligodendrocytes, and DG neurons. These novel findings advance our understanding of the effects of DOX and ACY-1083 treatment on different cell types which has potential implications in treating CICI.

**Acknowledgments:** This study was funded by NIH RO1CA208371, NS073939, and NIH RO1CA227064 to CJH and AK, and the MD Anderson Cancer Center Core Grant NIH P30CA016672.

***Inquiries at Super-Resolution: Is Genome Organization a Platform for Gene Regulation?***

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**Background.** The way that the genome is folded and packed in the nucleus is of major importance. A multitude of studies have shown that the organization of genomes can influence gene expression. However, other studies contrasted this view by showing that genome wide disruption of chromosomal loop domains does not lead to significant changes in gene expression. These contrasting views are likely to be affected by these ensemble-level studies averaging over millions of structures and transcriptomes.

**Goal.** Here we introduce a new multiplexed imaging technology for visualizing chromosomal DNA at super-resolution and its integration with Hi-C data to produce three-dimensional models of chromosome organization. The method we develop bridges the gap between imaging, fixed-cell methods such as FISH, and molecular methods such as Hi-C.

**Results.** Using the super-resolution microscopy methods of OligoSTORM and OligoDNA-PAINT, we trace eight Mbp of human chromosome 19, which is the longest stretch of genomic DNA investigated thus far with super-resolution microscopy. Leveraging this technology, we discover different packaging levels of genomic elements that range in size from a few kilobases to over a megabase.

**Conclusions.** We obtain evidence that maternal and paternal homologous regions are organized differently. And, focusing on chromosomal regions that contribute to compartments, we discover distinct structures that can predict whether such regions correspond to compartments of active or inactive genes.

Funding: Cancer Prevention Research Institute of Texas (R210018), UT STAR award.

## ***Multiplexing scATAC and scATAC&RNA Sequencing with Unmodified Oligonucleotides***

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### **Background**

Single-cell ATAC-seq (scATAC-seq) methods have emerged as powerful tools to measure the chromatin accessibility landscape and investigate the role of transcription factors at promoters, enhancers, activators and insulators at single cell genomic resolution. While microdroplet-based methods can generate data on thousands of cells from a single sample, it remains difficult and expensive to run these assays on large sample collections, since each sample must be run in a single microfluidics channel.

### **Goals**

Develop a simple, highly scalable and accuracy multiplexing method to realize multiplexing large-scale scATAC-seq and single cell ATAC&RNA co-assays (10X Genomics) on microdroplet platforms. If possible, the method will avoid any additional experimental steps to barcode and label the cells in advance.

### **Methods**

The SNuBar-ATAC approach utilizes a simple workflow by adding a single oligonucleotide barcode during the existing tagmentation step in the scATAC assays to label each sample with a unique identifier that is demultiplexed in the data post-processing steps.

### **Results**

We validated the performance, efficiency and scalability of SNuBar-ATAC in cell line experiments and applied it to two different biological applications, including profiling chromatin accessibility changes induced by drug treatment combinations and studying macro-spatial areas of breast tissue regions. Additionally, we applied SNuBar for multiplexing single cell ATAC&RNA co-assays of combined samples from cell lines and human breast tissues.

### **Conclusions**

Our data show that SNuBar is a highly accurate, easy-to-use and scalable system for multiplexing scATAC-seq and scATAC&RNA-seq experiments.

### **Funding sources**

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### ***Bifurcation Cells Identification and Characterization Using Higher-order Interactions***

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#### **Background**

Multi-cell organism development involves a lot of transitions between different cell types and cell states. If the behaviors of the cell change qualitatively after the transitions, it's called bifurcation. The bifurcation process is heterogeneous and contains important gene regulatory networks changes. These changes play an important role in cell fate determination for both normal and disease.

#### **Hypothesis/Goals**

Tumor cells genesis and metastasis can be described using the dynamic process. By using the math equations, one can identify bifurcation cells and gain more in-depth information about tumor dynamics from the quantitative aspect. This information can potentially help with prognosis and finding the right targets for the therapy.

#### **Methods**

Single-cell RNA-seq data were first pre-processed for QC. The cell type of each cell were manually identified using marker genes. Within each cell type, cells were ordered using pseudotime and formed meta-cells. Top 100 most variable genes were extracted for Pearson's correlation coefficient calculation. The absolute value of correlations were used to identify bifurcation cells. Gene pairs with highest correlation coefficients were selected for further analysis and interpretation.

#### **Results**

We used single-cell RNA-seq data of normal fetal developmental foveal retina RGCs at week 10 to calculate the Pearson's correlation coefficients of top 100 most variable genes. We found three groups of bifurcation cells in RGCs and some adhesion related genes. We also applied this method to AML patients data. We found the percentage of bifurcation tumor cells were higher in both two non-responder patients after the treatment than before the treatment. Gene pairs which have a high Pearson's correlation within these bifurcation cells are stemness related, including CD34 and SPINK2. This indicates the regulatory relations of these stemness genes are stronger after the treatment comparing to those before the treatment.

#### **Conclusions and Discussion**

Bifurcation is an important and dynamic process during cell development for both normal and disease. We proposed a quantitative bottom-up model to describe this process and mathematically proved bifurcation cells tend to have higher absolute values of gene-pair Pearson's correlation coefficients. However, further analysis such as regulatory network inference are needed to get the whole picture of cell fate determination.

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***scDevMaster: A Machine Learning Workflow to Prioritize Master Regulators Driving Cell Differentiation Processes***

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**Background:** Understanding cell differentiation processes and underlying gene regulatory programs are extremely important in fields such as disease molecular biology and regenerative medicine. Current experimental methods to unravel master regulators driving cellular differentiation processes are typically laborious, low-throughput and often require extensive prior knowledge. However, prior knowledge is sometimes inaccessible. These constraints have limited the identification of master regulators for many given specific cellular processes.

**Goals:** To build an unsupervised framework using single cell RNA-seq (scRNA-seq) datasets, which can more efficiently unravel (1) master regulators for a given cellular differentiation process and (2) the underlying gene regulatory network associated.

**Methods:** We developed scDevMaster, a machine learning workflow, to solve the above issues in master regulators identification. scDevMaster includes three steps. The first step is to construct several gene regulatory networks (GRNs) in chronological order. We use the pseudotime determined by Monocle 3 and the differentiation potency calculated by CCAT to infer the cell stage. Next, we use principal-component (PC) regression method on cells from the same stage to build a GRN based on their scRNA-seq data. The second step is to regress the stage index on the interaction level for each pair of genes with GRNs at different stages. The beta coefficient of the linear regression illustrates the trend of their interactions across the stages. By collecting the beta coefficient of all pairs of genes, we obtain a beta matrix, which reflects the global profile of gene regulations as a function of pseudotime. In the last step, we use manifold learning method to compress the information of the beta matrix into a low dimensional matrix and identify genes that regulate differentially across the pseudotime.

**Results:** We validated our framework through analyzing three published time-resolved datasets, including 1) differentiating neurons from zebrafish hindbrain, 2) human SCC6 cell line treated with cetuximab, and 3) developing mouse cardiomyocytes. The top-ranking candidates and associated signaling pathways found by scDevMaster aligned well with previous studies, suggesting their role as master regulators controlling cell differentiation during the corresponding cellular processes.

**Conclusions:** We demonstrated that scDevMaster was able to prioritize high confidence candidate master regulators driving complex biological phenomena such as cell differentiation process and cellular response to drug treatments.

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