

# Automating Immunology: From Raw Data to Insight

Aishwarya Gogate
Senior Bioinformatics Analyst
January 30, 2025

## My background

#### **BE** in Biotechnology

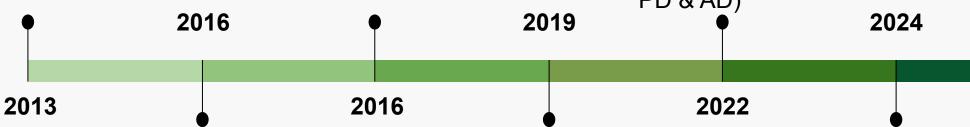
Visvesvaraya Technological University, Bangalore India

#### **Computational Biologist**

UTSW Med Ctr, Dallas TX (epigenetics & chromatin biology lab)

#### **Bioinformatics Scientist**

Cajal Neuroscience -Computational biology team (target discovery efforts in PD & AD)



## MS in Bioinformatics

University of Michigan, Ann Arbor

### Bioinformatics Scientist

BBI & Seattle Children's
- Computational biology
team in the single-cell
genomics core

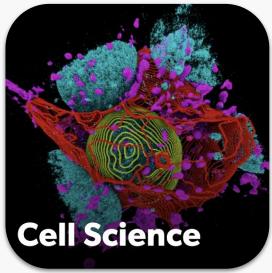
### Allen Institute for Immunology (Computational Biology team)

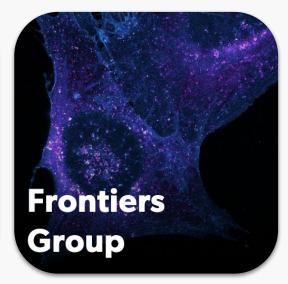




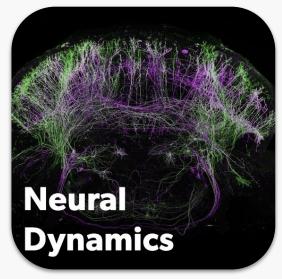
## Science Programs at the Allen Institute



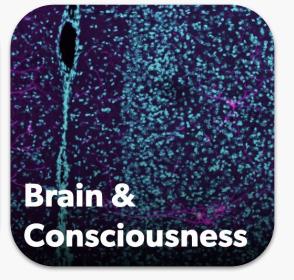














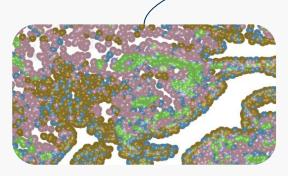
## Allen Institute for Immunology (AIFI)





## **Our Research**

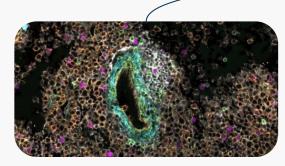




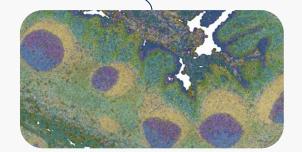
**Autoimmunity** 

Tissue

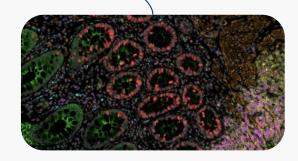
**Immunity** 



Cancer



Immune Health & Aging



Inflammation

Neuroimmune Interactions



## **Our Leadership Team**



**Executive Vice President** 

**Experimental Immunology** 



Troy Torgerson, M.D., Ph.D



Ernie Coffey, MBA



Lynne A. Becker, Ph.D.

Scientific Operations & Program Management

**Computational Biology** 



Xiaojun Li, Ph.D.



Peter Skene, Ph.D.

High Resolution Translational Immunology

Software Development



Paul Meijer, Ph.D.

## **Team Science at AIFI!**

**Immunologists** Wealth of expertise to 01 Bioinformaticians & Biostatisticians draw from Software Engineers Exposure to research from different business units 02 **Allen Hour** Great for networking and early career exploration Interact with other scientists at all levels 03 **Lunch and Learn** Meet interns from other science units



## "Testimonials"

"My internship at the Allen Institute for Immunology was a great experience. I had the opportunity to work on a project focused on understanding the healthy immune system at baseline and its responses to 'dys'regulation in children.

Additionally, I collaborated with the spatial transcriptomics team on tasks beyond my primary project, which was a great learning experience and rewarding. Beyond the work itself, I found the people at the Allen Institute to be welcoming and open to discussing their research. The supportive and collaborative work culture made the experience even more enjoyable."

- Temi Adewunmi (Current Bioinformatics Analyst at AIFI and U of Oregon alumni) "Allen Institute is really at the forefront of impactful and highly collaborative research. It offers a unique opportunity to learn from a wide range of experts in immunology, single-cell sequencing, software development, and statistics. People here are really invested in growing your knowledge."

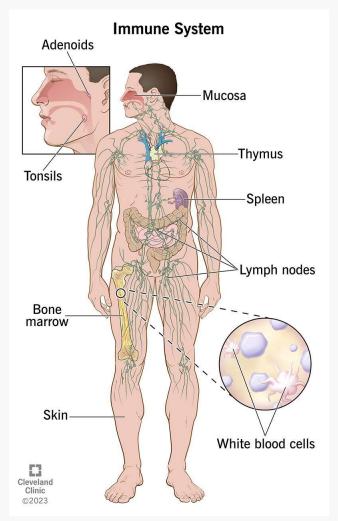
- Christian La France (Current Bioinformatics Analyst at AIFI and U of Oregon alumni)

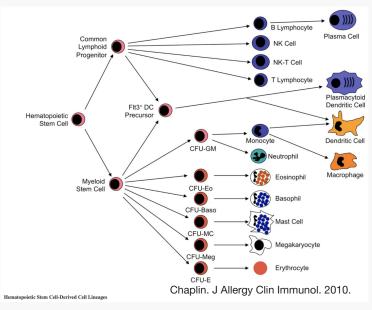
"My time as a postbaccalaureate research assistant has been a fantastic learning experience - I've had the **support to grow and develop** new skills along the way, and the **team science focus** of the institute has allowed me to **explore my interests beyond my direct position**. I've always felt welcome to ask even the most basic of questions, and felt welcomed from the beginning even as I was still finding my computational footing."

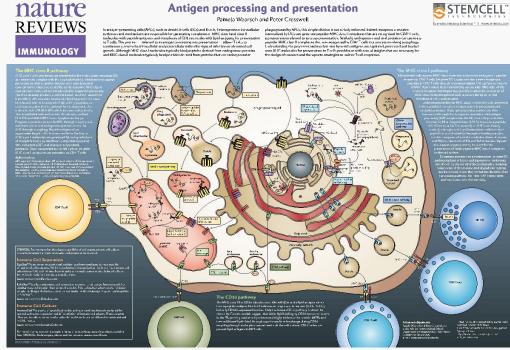
- Jazmine Castillo
Postbaccalaureate Researcher



## The Immune System Is Complex



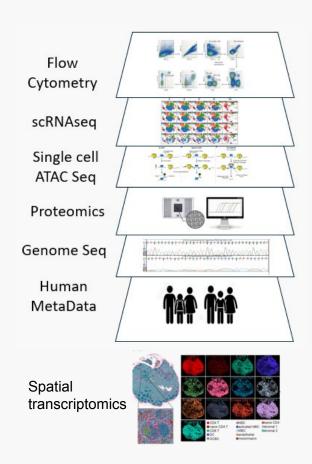


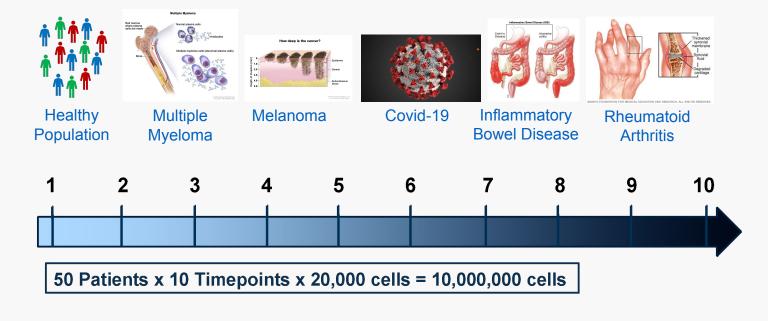


# And Plays Essential Roles in Health & Disease



# **Longitudinal Multi-Omics Studies in Human & Mouse - Immune States or Diseases**





#### Goals

- To understand disease mechanisms
- To identify disease diagnostic biomarkers and/or therapeutic targets
- To better understand biology/immunology
- To disseminate our huge amount of data to the public



## A Recent Study on Immune Health and Aging





HOME I SUBI

New Results

**♣** Follow this preprint

### Longitudinal Multi-omic Immune Profiling Reveals Age-Related Immune Cell Dynamics in Healthy Adults

- 🔟 Qiuyu Gong, 🔟 Mehul Sharma, 🔟 Emma L. Kuan, 🔟 Marla C. Glass, 🔟 Aishwarya Chander, 🔟 Mansi Singh,
- D Lucas T. Graybuck, Zachary J. Thomson, Christian M. LaFrance, Samir Rachid Zaim, Tao Peng,
- Dalaren Y. Okada, Palak C Genge, Katherine E. Henderson, Elisabeth M. Dornisch, Erik D. Layton,
- Deter J. Wittig, Delevander T. Heubeck, Delson M. Mukuka, Dellan Reading, Deltarles R. Roll,
- Ueronica Hernandez, Vaishnavi Parthasarathy, Tyanna J. Stuckey, Blessing Musgrove,
- D Elliott Swanson, Cara Lord, Morgan D.A. Weiss, Cole G. Phalen, Regina R. Mettey, Kevin J. Lee,
- Description John B. Johanneson, Erin K. Kawelo, Dessica Garber, Dupaasana Krishnan, Megan Smithmyer,
- 🗓 E. John Wherry, 🗓 Laura Vella, 🗓 Sarah E. Henrickson, 🗓 Mackenzie S. Kopp, 🗓 Adam K. Savage,
- D Lynne A. Becker, D Paul Meijer, Ernest M. Coffey, D Jorg J. Goronzy, Cate Speake, Thomas F. Bumol,
- Claire E. Gustafson

doi: https://doi.org/10.1101/2024.09.10.612119

This article is a preprint and has not been certified by peer review [what does this mean?].





Qiuyu Gong



Mehul Sharma



Peter J. Skene



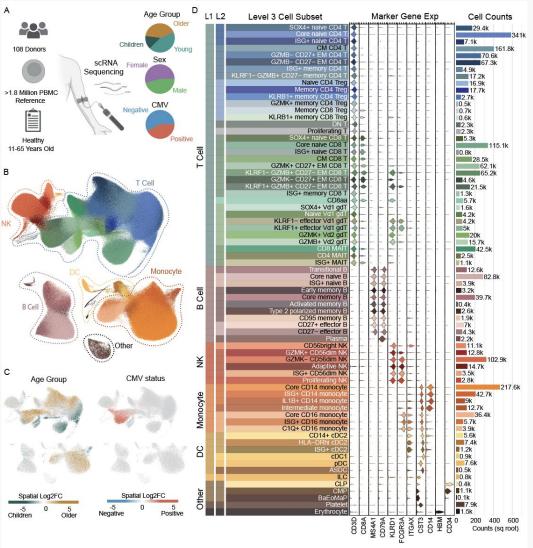
Claire E. Gustafson



Jane Buckner

Feature	Count
Cohort 1	
Donors	96
Samples	868
Cells (scRNA)	>13.7 million
Plasma proteomic measurements	>1.3 million
Cohort 2	
Donors	234
Samples	234
Cells (scRNA)	3.2 million
Serum proteomic measurements	>0.77 million

## In-Depth Labeling of PBMCs



Cell Type	Subsets
T cells	35
B cells	11
Monocytes	7
Natural killer cells	6
Dendritic cells	6
Others	6
Total	71

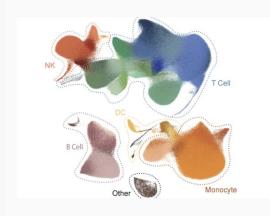
- scRNA-seq data
   with >16M PBMCs
- 71 immune cell subsets



## Large data releases with Data Apps

### **Data Apps**

Large data releases by scientists at the Allen Insitute for Immunology



#### **AIFI Immune Health Atlas**

Claire E Gustafson, Peter J Skene, Ananda W Goldrath, Xiao-jun Li, Troy R Torgerson, Lynne A
Becker, Thomas F Bumol, Aishwarya Chander, Ernest M Coffey, Elisabeth M Dornisch, Jessica
Garber, Palak C Genge, Marla Glass, Qiuyu Gong, Katherine E Henderson, Veronica
Hernandez, Alexander T Heubeck, John B Johanneson, Erin K Kawelo, Mackenzie S Kopp,
Upaasana Krishnan, Emma L Kuan, Christian M LaFrance, Erik D Layton, Kevin J Lee, Cara
Lord, Regina R Mettey, Nelson M Makuka, Blessing Musgrove, Lauren Y Okada, Vaish
Parthasarathy, Tao Peng, Cole G Phalen, Samir Rachid Zaim, Julian Reading, Charles R Roll,
Mehul Sharma, Mansi Singh, Tyanna J Stuckey, Elliott Swanson, Zachary J Thomson, Morgan
DA Weiss, Peter J Wittig, Jane H Buckner, Megan Smithmeyer, Cate Speake, Sarah
Henrickson, Laura Vella, E John Wherry, Yousef Aggoune, Madeline Ambrose, Aldan
Beaubien, James Harvey, Nicole Howard, Neelima Inala, Ed Johnson, Autumn Kelsey, Melissa
Kinsey, Jessica Liang, Paul Mariz, Stark Pister, Sathya Subramanian, Vitalii Tereschenko, Anne
Vetto, Paul Meyer and Lucas T Graybuck

File Set

Visualization

An atlas of peripheral immune cells collected from 108 healthy adults and children

- Quickly look up gene expression
- Visualize and inspect PBMCs on a UMAP
- Investigate

   sample metadata
   & clinical lab
   results



## A Recent Study on Rheumatoid Arthritis

### Systemic inflammation and lymphocyte activation precede rheumatoid arthritis

- D Ziyuan He, Marla C. Glass, Pravina Venkatesan, Marie L. Feser, Leander Lazaro, Lauren Y. Okada, Nhung T.T. Tran, Yudong D. He, Samir Rachid Zaim, Christy E. Bennett,
- Department Padmapriyadarshini Ravisankar, Department M. Dornisch, Najeeb A. Arishi, Ashley G. Asamoah, Saman Barzideh, Department Lynne A. Becker, Elizabeth A. Bemis, Department Jane H. Buckner, Christopher E. Collora, Megan A. L. Criley, M. Kristen Demoruelle, Chelsie L. Fleischer, Description Jessica Garber, Palak C. Genge,
- Diuyu Gong, Lucas T. Graybuck, Claire E. Gustafson, Brian C. Hattel, Veronica Hernandez,
- D Alexander T. Heubeck, D Erin K. Kawelo, D Upaasana Krishnan, D Emma L. Kuan, Kristine A. Kuhn,
- Christian M. LaFrance, (D) Kevin J. Lee, (D) Ruoxin Li, (D) Cara Lord, Regina R. Mettey, Laura Moss,
- D Blessing Musgrove, Kathryn Nguyen, Andrea Ochoa, D Vaishnavi Parthasarathy, Mark-Phillip Pebworth,
- Chong Pedrick, D Tao Peng, Cole G. Phalen, D Julian Reading, Charles R. Roll, Jennifer A. Seifert,
- Marguerite D. Siedschlag, De Cate Speake, Christopher C. Striebich, Tyanna J. Stuckey, Elliott G. Swanson, Hideto Takada, Tylor Thai, De Zachary J. Thomson, Nguyen Trieu, Vlad Tsaltskan, Wei Wang, Morgan D. A. Weiss,
- Amy Westermann, D Fan Zhang, David L. Boyle, D Ananda W. Goldrath, D Thomas F. Bumol, D Xiao-jun Li,
- U. Michael Holers, Peter I. Skene, Adam K. Savage, Gary S. Firestein, Kevin D. Deane,
- Troy R. Torgerson, Mark A. Gillespie

doi: https://doi.org/10.1101/2024.10.25.620344











Marla Glass



Adam Savage



Troy Torgerson



Mark Gillespie



Gary Firestein



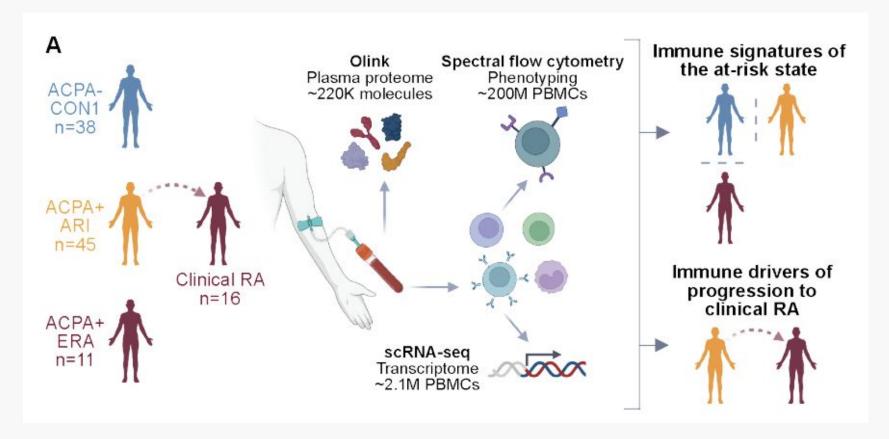
Kevin Deane

Feature	Count
Cohort 1	
Donors	94
Samples	141
Cells (scRNA)	>2.1 million
Cells (flow cytometry)	>200 million
Plasma proteomic measurements	>0.22 million
Cohort 2	
Donors	12
Samples	12

~90k

Cells (TEA-seq)

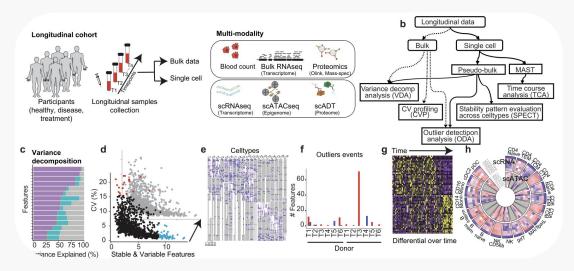
# At-Risk-Individuals exhibit signs of systemic inflammation prior to the onset of clinical RA



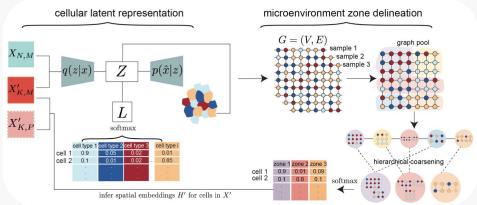
- RA is a chronic autoimmune disease
  - autoantibodies
  - o joint inflammation
- Elevated ACPA are a predictor of disease
  - identify "at-risk" for developing RA
- Data
  - Hi-Res protein abundance
  - Genomics Assays
  - Multiple time points

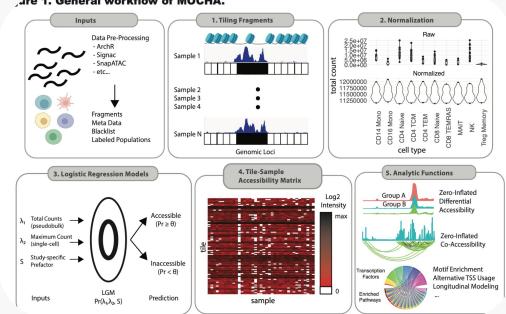


# We Develop and Disseminate Novel Methodologies Are 1. General workflow of MOCHA. Inputs Inputs Inputs Inputs



Vasaikar et al. A Comprehensive Platform to Analyze Multimodal Longitudinal Omics Data. Nature Communications (2023) 14:1684.





Rachid Zaim & Pebworth, et al. MOCHA: advanced statistical modeling of scATAC-seq data enables functional genomic inference in large human disease cohorts. Nature Communications (2024) 15: 6828.

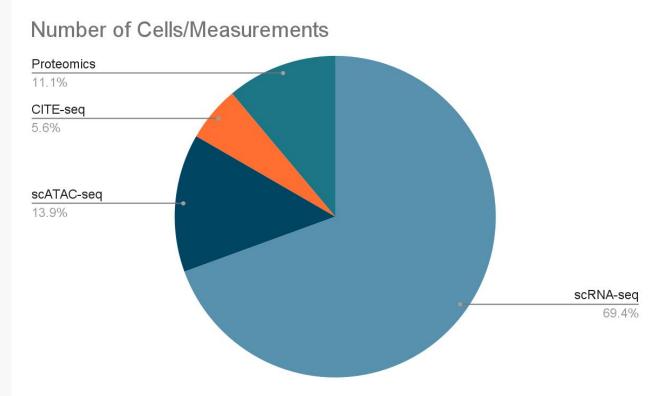
Zhao, et al. SPARROW reveals cell states and functions influenced by microenvironment zones in complex tissues.

(Now accepted at Cell Systems)



## Wealth of Data Generated

- Human immune states or immune diseases studied: 18
- Human participants studied: 2422
- Human samples analyzed: 4699
- Flow cytometry: 3672 (~4 trillion cells)
- Spatial Biology (CellDive, Xenium, Visium, scRNA): 252
- Human datasets submitted to GEO/dbGaP:
  - 12 studies, 1896 samples





# **Human Immune System Explorer (HISE)**



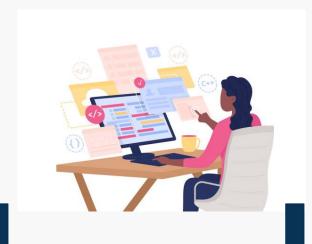
Paul Meijer

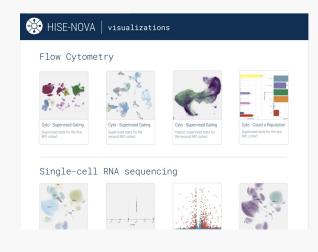
A platform with tools enabling scientists to work with large, complex data

Data Collection Analysis Pipelines Secondary Analysis Results





























XLS



## We Are Actively Working on New Frontiers

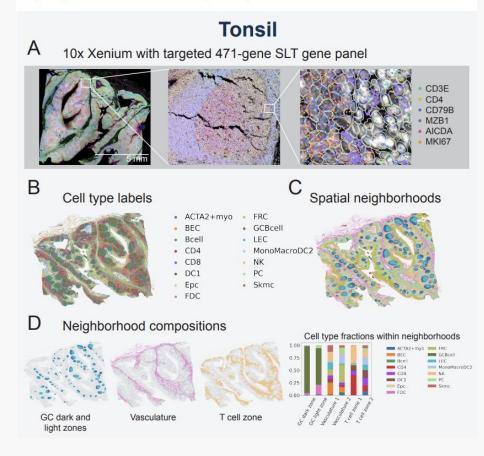
### What is spatial biology?

- Spatial biology is the study of how cells are organized within a tissue and how they interact/behave in this context.
- Combination of microscopy and scRNA-seq,
   opening up totally new questions that we can ask

### **Bioinformatics for Spatial Biology**

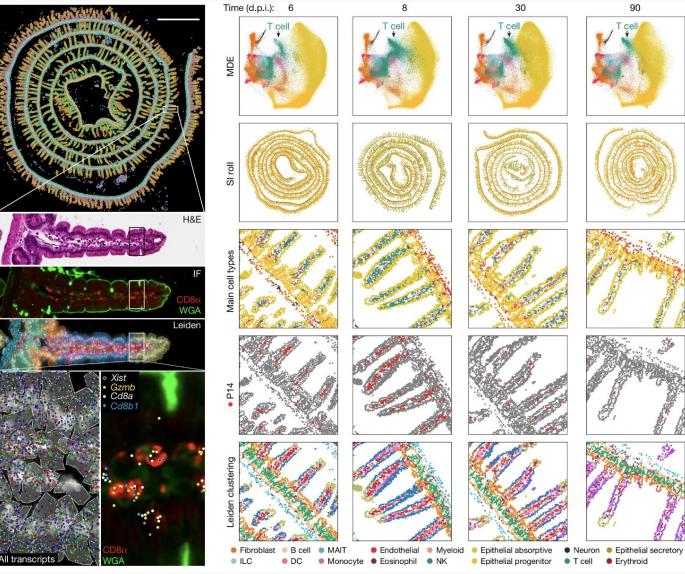
- Develop and implement data analysis pipelines for analysis across different tissues in human & mouse
  - SLT LN and tonsil
  - Gut
  - Lung
  - Bone marrow

## A spatial analysis framework for secondary lymphoid tissues (SLT)





## Beautiful spatial data of the gut



- Spatial transcriptomics data of the small intestine
- Capture cellular locations along three anatomical axes of the SI
- Visualize the spatiotemporal distribution of cell types and gene expression
- T cell location and functional state are fundamentally intertwined

## **Our Collaborators**















University of Colorado **Denver** 









Phil Greenberg

Damian Green

K. Demoruelle

Kristine Kuhne

Gary Firestein David Boyle









Jane Buckner











Julie McElrath Julie Czartoski

Raphael Gottardo

John Wherry

\*Penn

A. Huang

L. Vella

M.Bewtra





Mariano Gabitto

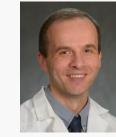




Cate Speake







S. Henrickson V.Tomov



## **CompBio Operations Team**



Ananda Goldrath, Ph.D. Executive Vice President, Director of Allen Institute for Immunology



**Lynne A. Becker, Ph.D.**Associate Director of Scientific
Program Management



Ernie Coffey, MBA

Executive Director, Scientific
Operations



Xiaojun Li, Ph.D.

Director, Informatics &

Computational Biology



Alina Ott, Ph.D.

Manager, Bioinformatics
Operations



Paul Meijer, Ph.D.
Director, Software
Development, Database, and
Pipelines



Peter Skene, Ph.D.
Director, High Resolution
Translational Immunology



Troy Torgerson, M.D., Ph.D Director, Experimental Immunology



**Aishwarya Gogate, M.S.** Sr. Bioinformatics Analyst



**Upaasana Krishnan, M.S.** Bioinformatics Analyst I



## CompBio Ops Vision

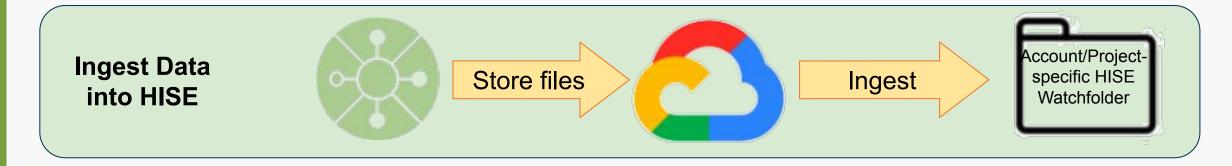


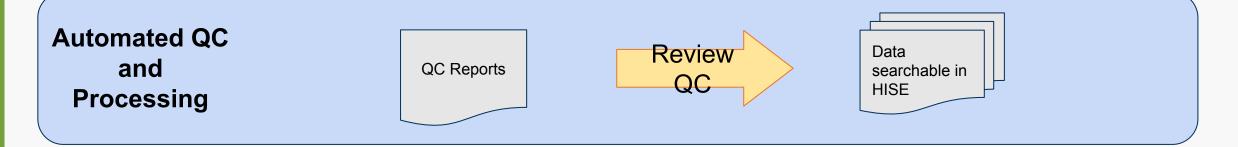
### Objectives:

- **Uphold Data Integrity**
- Accelerate Insights Through **Automation and Standardization**
- Streamline Data Access
- Bridge Knowledge Gaps

# **Objective: Uphold Data Integrity**



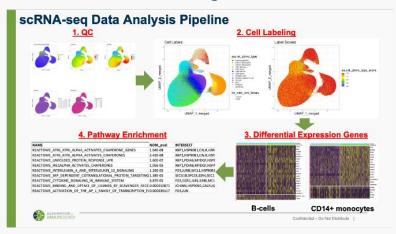






# Data Integrity is Critical for Downstream Applications

### **Analysis**



### **Open Science**







### **Publication**

**lournal of Translational Medicine** 

CryoSCAPE: Scalable immune profiling using cryopreserved whole blood for multi-omic single cell and functional assays

Jan 03, 2025

Alexander T. Heubeck, Cole Phalen, Neel Kaul, Peter J. Wittig, Jessica Garber, Morgan Weiss, Palak C. Genge, Zachary Thomson, Claire...

READ MORE ->

Nature Communications

MOCHA's advanced statistical modeling of scATAC-seq data enables functional genomic inference in large human cohorts Aug 09, 2024

Samir Rachid Zaim, Mark-Phillip Pebworth, Imran McGrath, Lauren Okada, Morgan Weiss, Julian Reading, Julie L. Czartoski, Troy R....

READ MORE ->

Journal of Immunological Methods

Development of a highthroughput image cytometric screening method as a research tool for immunophenotypic characterization of patient samples from clinical studies lan 01, 2024

Samir Patel, James I. McDonald, Hamza Mohammed, Vaishnavi Parthasarathy, Veronica Hernandez, Tyanna Stuckey, Allen H. Lin,...

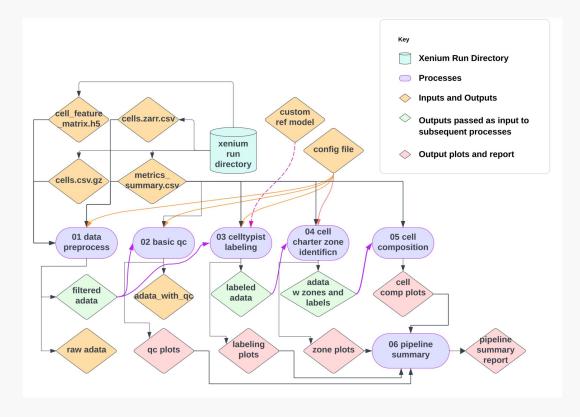
READ MORE ->



# Objective: Accelerate Insights Through Automation and Standardization

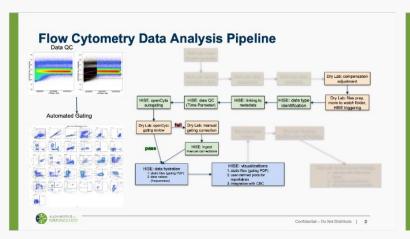
Jupyter

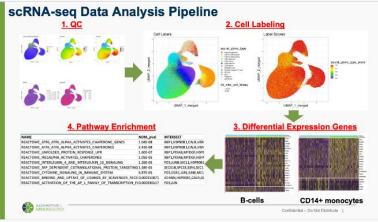
- Implementation of new pipelines
- Pipeline updates to expand scope of automation, increase speed/efficiency, and incorporate the latest tools
- Create templates, functions, and/or packages for common analyses

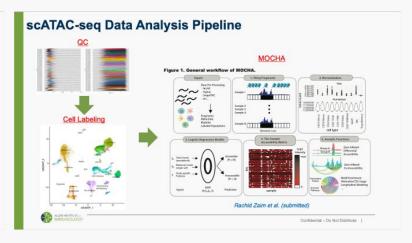


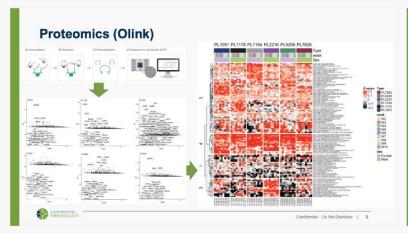


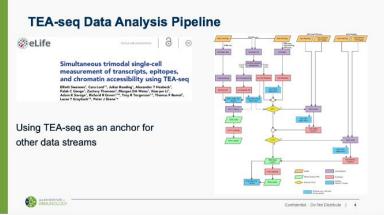
## **Maintain and Enhance Pipelines**

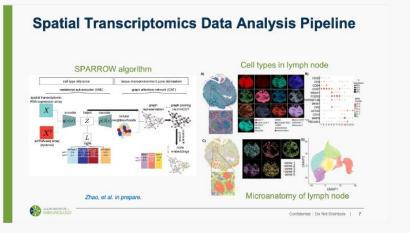














## Potential projects for the intern

Engage in deep biological interrogation and computational tool development



### Revamp single-cell data processing pipelines

- Improve and standardize cell type labeling methods
- Improve upon metrics captured within QC reports
- What you will learn: Work on new data modalities, identify anomalies in seq data, build robust pipelines, communicate findings



# Assist in implementing a new spatial (Xenium) data processing pipeline

- Build data dashboards to visually track QC metrics for spatial data over time
- This will assist wet lab scientists in making the platform more efficient
- What you will learn: End user survey, clean coding, code review, engage in meaningful scientific discussions, literature review





### **THANK YOU**

We wish to thank the Allen Institute founder, Paul G. Allen, for his vision, encouragement, and support.



