

Single Cell TCR and BCR

Guochao Li (liguochao@big.ac.cn)

Research Assistant from Jiang Lab

Beijing Institute of Genomics, Chinese Academy of Sciences

China National Center for Bioinformation

2025.05.07

Outline

1. Introduction of immunity
2. Single cell TCR and BCR
3. Analysis of scTCR and scBCR data 1: from 10X Genomics raw data (.fastq format) to contig files by cellranger vdj
4. Analysis of scTCR and scBCR data 2: scRepertoire

Outline

1. Introduction of immunity
2. Single cell TCR and BCR
3. Analysis of scTCR and scBCR data 1: from 10X Genomics raw data (.fastq format) to contig files by cellranger vdj
4. Analysis of scTCR and scBCR data 2: scRepertoire

Immunity is very important, and a hotspot in life science research

In 2024, it is the 50th anniversary of the founding of *Cell*. To commemorate this milestone, *Cell* plans to launch a year-long series of anniversary events, including a special issue on *Immunology*. On April 25th, *Cell* published an editorial article, emphasizing that immunology is a field for everyone, playing a crucial role in multiple areas such as tumor immunology, neuroimmunology, immunometabolism, and reproductive immunology. On the same day, *Cell* published three heavyweight reviews, covering adaptive immunity, innate immunity, and discussions on the latest perspectives in immunology, providing a comprehensive interpretation of human immunology.

50 CellPress
OPEN ACCESS

Review

Principles and therapeutic applications of adaptive immunity

Hongbo Chi,^{1,*} Marion Pepper,^{2,*} and Paul G. Thomas^{3,*}

¹Department of Immunology, St. Jude Children's Research Hospital, Memphis, TN, USA

²Department of Immunology, University of Washington, Seattle, WA, USA

³Department of Host-Microbe Interactions and Department of Immunology, St. Jude Children's Research Hospital, Memphis, TN, USA

*Correspondence: hongbo.chi@stjude.org (H.C.), mpepper@uw.edu (M.P.), paul.thomas@stjude.org (P.G.T.)

<https://doi.org/10.1016/j.cell.2024.03.007>

Cell
Leading Edge

50 CellPress
OPEN ACCESS

Review

From periphery to center stage: 50 years of advancements in innate immunity

Susan Carpenter^{1,*} and Luke A.J. O'Neill^{2,*}

¹University of California Santa Cruz, 1156 High St., Santa Cruz, CA 95064, USA

²School of Biochemistry and Immunology, Trinity Biomedical Sciences Institute, Trinity College Dublin, Dublin, Ireland

*Correspondence: susan.carpenter@ucsc.edu (S.C.), looneil@tcd.ie (L.A.J.O.)

<https://doi.org/10.1016/j.cell.2024.03.036>

Cell
Leading Edge

Cell
Leading Edge

Perspective

Exploring new perspectives in immunology

Ruslan Medzhitov^{1,2,3,*} and Akiko Iwasaki^{1,2,3,*}

¹Department of Immunobiology, Yale University School of Medicine, New Haven, CT, USA

²Howard Hughes Medical Institute, Chevy Chase, MD, USA

³Center for Infection and Immunity, Yale School of Medicine, New Haven, CT, USA

⁴Tanenbaum Center for Theoretical and Analytical Human Biology, Yale School of Medicine, New Haven, CT, USA

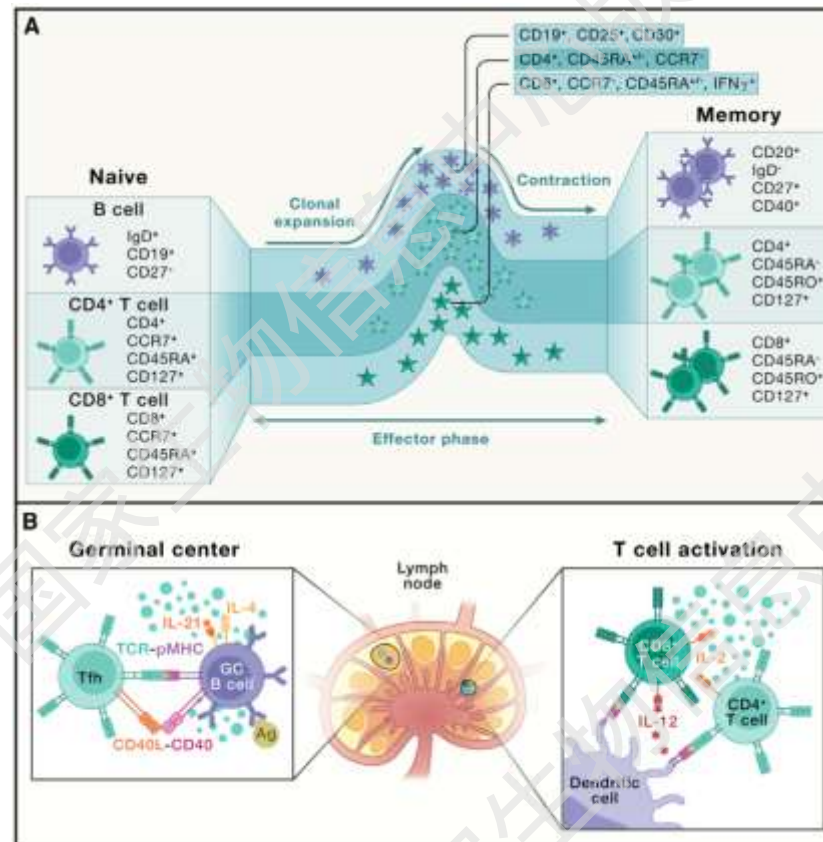
*Correspondence: ruslan.medzhitov@yale.edu (R.M.), akiko.iwasaki@yale.edu (A.I.)

<https://doi.org/10.1016/j.cell.2024.03.058>

50 CellPress

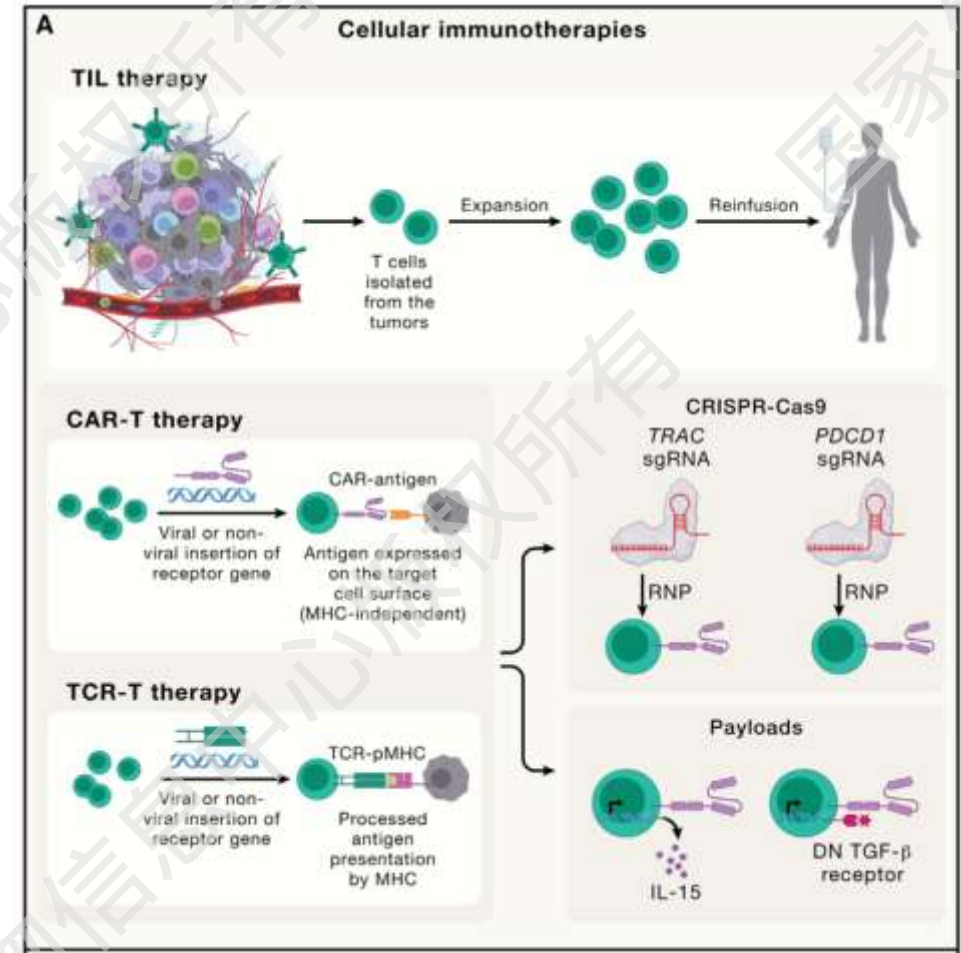
Adaptive immune cell states and the primary response

B cells, CD4⁺ T cells, and CD8⁺ T cells acquire multiple differentiation fates during a normal immune response. Naive T cells and B cells are quiescent cells. Upon activation, these cells undergo clonal expansion and acquire effector function (effector phase). Following pathogen control, most effector cells undergo apoptosis (contraction), leaving long-lived memory cells to provide continued immune surveillance (memory).



Engineering adaptive immune responses for cell- and antibody-based therapies

TIL, CAR-T, and TCR-T are three prominent cellular immunotherapies for cancer. For TIL therapy, T cells are isolated from the tumors for expansion and reinfusion into tumor patients; for CAR-T cells, CARs are engineered to recognize surface antigen independently of MHC-mediated antigen presentation; for TCR-T, a specific TCR gene recognizing the tumor antigen is ectopically expressed in T cells to expand tumor-specific T cells for tumor killing, which requires peptide-MHC (pMHC) expression on tumor cells. For CAR-T or TCR-T therapies, new strategies have been developed to modify intracellular signaling pathways in these tumor-specific T cells to enhance tumor killing, such as CRISPR-mediated genome editing of the *TRAC* or *PDCD1* locus or introduction of payloads (e.g., cytokines like IL-15 and dominant-negative [DN] TGF- β receptor) expressed on T cells. These strategies increase the antitumor function in these cellular therapies.

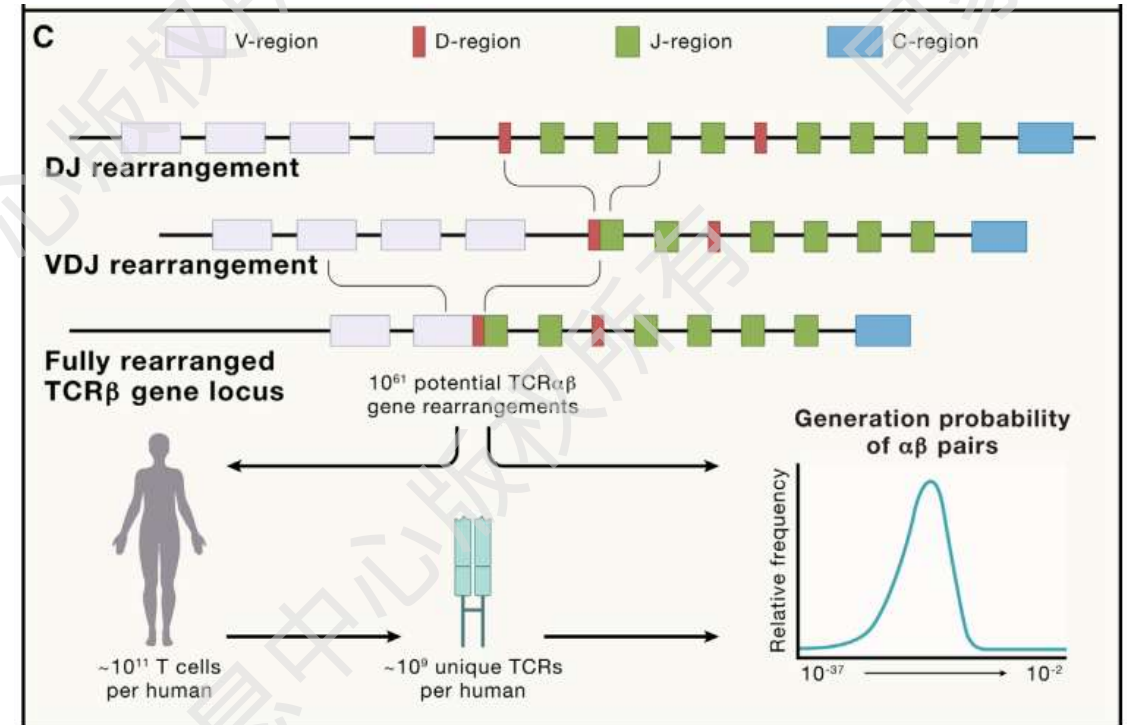


Outline

1. Introduction of immunity
2. Single cell TCR and BCR
3. Analysis of scTCR and scBCR data 1: from 10X Genomics raw data (.fastq format) to contig files by cellranger vdj
4. Analysis of scTCR and scBCR data 2: scRepertoire

The generation of antigen receptor (TCRs and BCR) diversity are generated by the process of V(D)J recombination

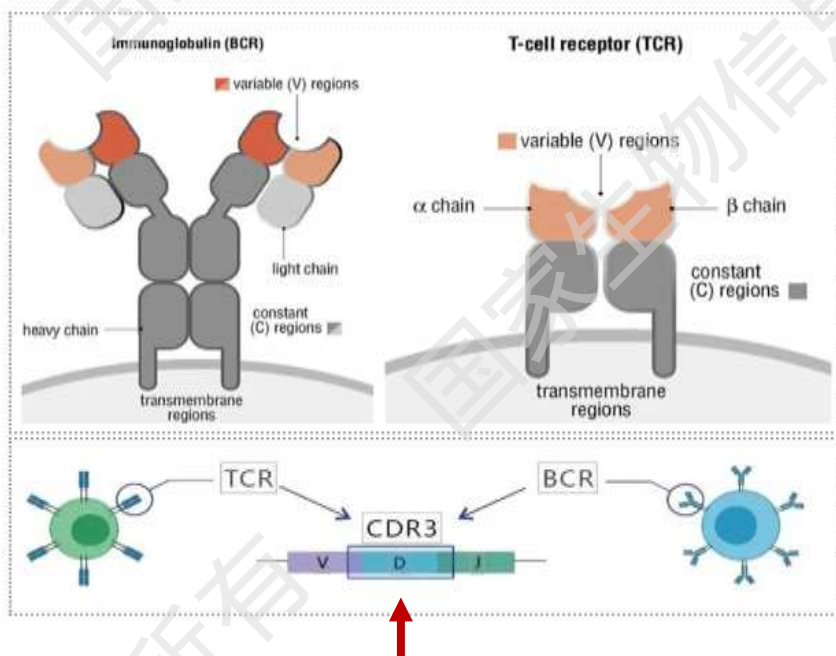
The generation of antigen receptor diversity. TCRs and BCRs are generated by the process of V(D)J recombination, which involves the fusion of separate V, D (on TCR β and heavy chains), and J segments. Depicted is a TCR β -chain recombination. Subsequent mRNA splicing brings the constant region together with the V(D)J fusion. This process can result in a vast potential diversity, which is only minimally represented in any individual organism. The distribution of probabilities for an individual TCR to recombine in an individual varies over 20 orders of magnitude.



The main detection objects of scTCR (single-cell TCR sequencing) and scBCR (single-cell BCR sequencing)

TCR and BCR are two distinct receptors, differing in both structure and function.

- **TCR V(D)J recombination:** The majority of TCRs are composed of α and β peptide chains (90-95%), while a minority of T cells have TCRs composed of γ and δ peptide chains. Each peptide chain can be divided into several parts. The most important part of them is the variable region. The variable region of the α chain is encoded by V and J gene segments, while the variable region of the β chain is encoded by V, D, and J gene segments.
- **BCR V(D)J recombination:** BCR contain two heavy chains (H) and two light chains (κ or λ). The heavy chain is divided into the variable region and other contact regions. The variable region of the light chain is encoded by V and J gene segments, while the variable region of the heavy chain is encoded by V, D, and J gene segments.
- **CDR3:** The BCR/TCR has a region known as the CDR, which plays a crucial role in antigen recognition. The CDR consists of CDR1, CDR2, and CDR3. Among them, CDR3 is formed by the encoding of V, D, and J genes, which has a higher degree of diversity and directly determines the antigen-binding specificity of TCR/BCR.



TCR				BCR			
TR	TCR- α chain	TRA	{ V, J, C }	IG	Heavy chain	IGH	{ V, D, J, C }
	TCR- β chain	TRB	{ V, D, J, C }		Light chain	{ λ }	{ IGLV, IGLJ, IGLC }
	TCR- δ chain	TRD	{ V, D, J, C }				{ IGKV, IGKJ, IGKC }
	TCR- γ chain	TRG	{ V, J, C }				

Locus	Chromosomal localization	Major loci				Total number of genes [2]
		V	D	J	C	
TRA	14q11.2	54*	0	81	1	116*
TRB	7p15	84-87	2	14	2	82-85
TRG	12p15	12-15	0	5	2	18-22
TRD	14q11.2	3 (8*)	3	4	1	11 (16*)
Total number of genes		133-139	5	84	8	228-234

TRA, TRB, TRD, TRG 这4个的 V, D, J, C 基因数量

Locus			Major loci					Total number of genes, [1]	
	Chromosomal localization	V	D	J	C				
IGH	14q32.33	129-128	27	6	11*			173-179*	
IGK	2p11.2	140* or 78	11	5	1			148* or 82	
IGL	22q11.2	73-74	0	7-11	7-11			82-96	
Total number of genes		236-278	27	25-26	19-23	363-364			

IG 分成 IGH, IGK, IGL 这3个的 V, D, J, C 基因数量

10X Genomics library preparation of 5' scRNA and scTCR/scBCR

The screenshot shows the 10x Genomics Support website. The browser address bar displays <https://www.10xgenomics.com/support>. The website header includes the 10x Genomics logo and navigation links for Products, Resources, Support Hub, and Company. A search bar is located in the top right corner. The main content area is titled "Welcome to 10x Genomics Support" and features three sections: "User Guides" (Find step-by-step user guides and protocols for your specific 10x Genomics product. Button: Find user guides), "Knowledge base Q&A" (Find answers to common technical questions, from sample prep through data analysis. Button: View Knowledge base Q&A), and "Search" (Search for technical documentation, datasets, videos, and more. Button: Search support content). Below these sections is a "Workflow Update for Chromium Next GEM Assays" announcement with a "Learn more" link. The "Product support" section is visible, listing various products under the "Chromium" category. The "Universal 5' Gene Expression" product is highlighted with a red border. Its description is: "5' gene expression alongside V(D)J repertoire profiling and antigen specificity of T and B cells." Other products listed include "Universal 3' Gene Expression", "Flex Gene Expression", "Epi ATAC", and "Epi Multiome ATAC + Gene Expression".

<https://www.10xgenomics.com/support>

10x GENOMICS Products Resources Support Hub Company Store Search

Welcome to 10x Genomics Support

User Guides
Find step-by-step user guides and protocols for your specific 10x Genomics product.
[Find user guides](#)

Knowledge base Q&A
Find answers to common technical questions, from sample prep through data analysis.
[View Knowledge base Q&A](#)

Search
Search for technical documentation, datasets, videos, and more.
[Search support content](#)

Workflow Update for Chromium Next GEM Assays [Learn more](#)

Product support

Chromium

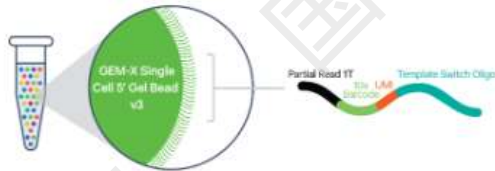
- Universal 3' Gene Expression**
3' gene expression profiling at scale with single cell resolution.
- Universal 5' Gene Expression**
5' gene expression alongside V(D)J repertoire profiling and antigen specificity of T and B cells.
- Flex Gene Expression**
Fixed RNA Profiling assay for comprehensive probe-based gene expression profiling with single cell resolution.
- Epi ATAC**
Chromatin accessibility profiling at the single cell level.
- Epi Multiome ATAC + Gene Expression**
Combined profiling of 3' gene expression and chromatin accessibility from the same cell.

10X Genomics library preparation of 5' scRNA and scTCR/scBCR

Chromium Single Cell

Universal 5' Gene Expression

i This assay requires Chromium X/iX instrument Firmware v2.0 or newer. Refer to the [Chromium X Series Firmware Update Procedure](#) for details



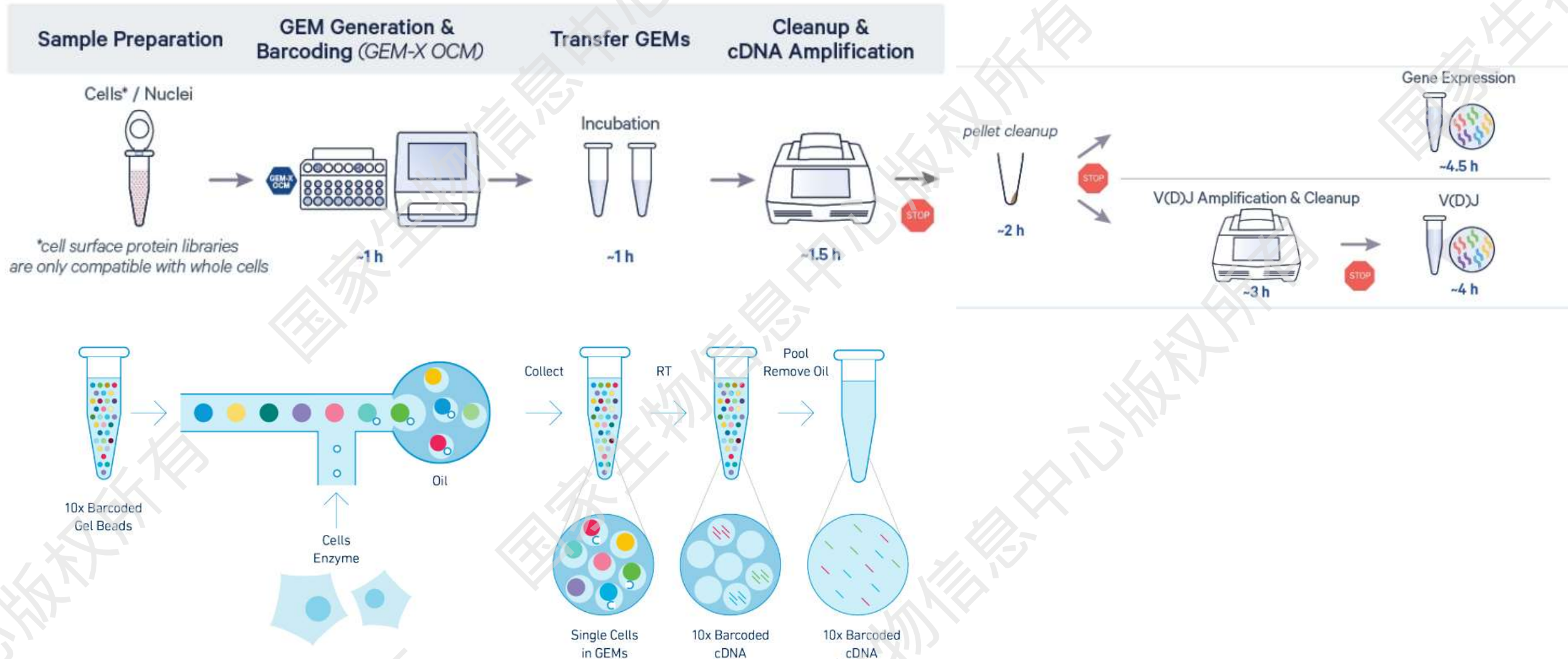
What is Universal 5' Gene Expression?

Chromium Universal 5' Gene Expression allows analysis of full-length, paired B-cell or T-cell receptor (BCR/TCR) sequences, surface protein expression, and 5' gene expression, all from a single cell.

[Find user guides](#)

[Get started](#)

10X Genomics library preparation of 5' scRNA and scTCR/scBCR



Outline

1. Introduction of immunity
2. Single cell TCR and BCR
3. Analysis of scTCR and scBCR data 1: from 10X Genomics raw data (.fastq format) to contig files by cellranger vdj
4. Analysis of scTCR and scBCR data 2: scRepertoire

10X Genomics scRNA+scTCR/scBCR rawdata in .fastq format

Path to rawdata/scRNA:

```
Sub01_S1_L001_R1_001.fastq.gz
Sub01_S1_L001_R2_001.fastq.gz
Sub01_S1_L002_R1_001.fastq.gz
Sub01_S1_L002_R2_001.fastq.gz
Sub01_S1_L003_R1_001.fastq.gz
Sub01_S1_L003_R2_001.fastq.gz
Sub02_S1_L001_R1_001.fastq.gz
Sub02_S1_L001_R2_001.fastq.gz
Sub02_S1_L002_R1_001.fastq.gz
Sub02_S1_L002_R2_001.fastq.gz
Sub02_S1_L003_R1_001.fastq.gz
Sub02_S1_L003_R2_001.fastq.gz
```

Path to rawdata/scTCR:

```
Sub01_S1_L001_R1_001.fastq.gz
Sub01_S1_L001_R2_001.fastq.gz
Sub01_S1_L002_R1_001.fastq.gz
Sub01_S1_L002_R2_001.fastq.gz
Sub01_S1_L003_R1_001.fastq.gz
Sub01_S1_L003_R2_001.fastq.gz
Sub02_S1_L001_R1_001.fastq.gz
Sub02_S1_L001_R2_001.fastq.gz
Sub02_S1_L002_R1_001.fastq.gz
Sub02_S1_L002_R2_001.fastq.gz
Sub02_S1_L003_R1_001.fastq.gz
Sub02_S1_L003_R2_001.fastq.gz
```

Path to rawdata/scBCR:

```
Sub01_S1_L001_R1_001.fastq.gz
Sub01_S1_L001_R2_001.fastq.gz
Sub01_S1_L002_R1_001.fastq.gz
Sub01_S1_L002_R2_001.fastq.gz
Sub01_S1_L003_R1_001.fastq.gz
Sub01_S1_L003_R2_001.fastq.gz
Sub02_S1_L001_R1_001.fastq.gz
Sub02_S1_L001_R2_001.fastq.gz
Sub02_S1_L002_R1_001.fastq.gz
Sub02_S1_L002_R2_001.fastq.gz
Sub02_S1_L003_R1_001.fastq.gz
Sub02_S1_L003_R2_001.fastq.gz
```

Same filename in different directory, just the same filename, not the same file!

10X Genomics scRNA+scTCR/scBCR rawdata in .fastq format

10X GENOMICS Products Resources Support Hub Company Store Search

Publications

Search abstracts, sample types, and more

AREA OF INTEREST	SPECIES	TISSUE TYPE	JOURNAL	10X GENOMICS PRODUCT
Immunology (659)	Human (980)	Blood (558)	Nature (78)	Universal 5' Gene Expression (1488) ✓
Cancer Research (589)	Mouse (519)	Tumor - solid (388)	Cell (65)	Universal 3' Gene Expression (7264)
Infectious Disease (113)	Primate (19)	Lymph Node (130)	Nature Immunology (63)	Spatial Gene Expression for Fresh Frozen (713)
Immuno-oncology (97)	Rat (7)	Spleen (128)	Immunity (61)	Linked-Reads Genomics (431)
Neuroscience (62)	Other - Mammal (4)	Lung (97)	Cell Reports (57)	Epi ATAC (407)
Assay Method (50)	Hamster (3)	Bone Marrow (95)		Epi Multiome ATAC (274)
Computational Method (43)	Drosophila (2)	Skin (69)		Spatial Gene Expression for FFPE (136)
				In Situ Gene Expression (52)
				Flex Gene Expression (27)
				Single Cell CNV (25)

Cellranger vdj: rawdata → contig files

Example cmd in shell:

```
/xtdisk/jiangl_group/yuchw/software/cellranger-8.0.0/bin/cellranger vdj \
--id=Sub01 \
--sample=Sub01 \
--reference=/xtdisk/jiangl_group/yuchw/reference/10X_ref/GRCh38/refdata-cellranger-vg-GRCh38-alts-ensembl-7.1.0 \
--fastqs=/p300s/ligchA_jianglgroup/ligchA/301_LiPing/batch5_20250223/data/UDA_scTCR \
--localmem=200 \
--localcores=10
```

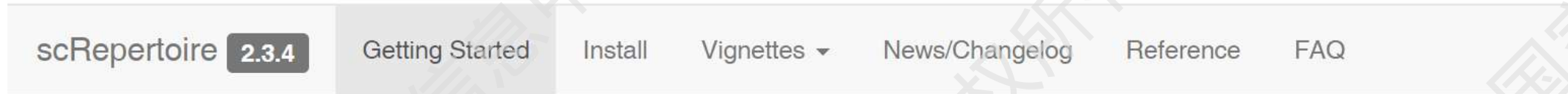
Example output:

```
[ligchA@loginb2:/p300s/ligchA_jianglgroup/ligchA/301_LiPing/batch5_20250223_20250317/analysis/UDA_scTCR/cellranger]
$ ls Sub01/outs/
airr_rearrangement.tsv  all_contig_annotations.bed  concat_ref.bam.bai  consensus.fasta.fai  metrics_summary.csv
all_contig.bam          all_contig_annotations.csv  concat_ref.fasta    consensus_annotations.csv  vdj_contig_info.pb
all_contig.bam.bai      all_contig_annotations.json  concat_ref.fasta.fai  donor_regions.fa       vdj_reference
all_contig.fasta        cell_barcode.json           consensus.bam         filtered_contig.fasta    web_summary.html
all_contig.fasta.fai    clonotypes.csv              consensus.bam.bai     filtered_contig.fastq
all_contig.fastq         concat_ref.bam               consensus.fasta        filtered_contig_annotations.csv
```


Outline

1. Introduction of immunity
2. Single cell TCR and BCR
3. Analysis of scTCR and scBCR data 1: from 10X Genomics raw data (.fastq format) to contig files by cellranger vdj
4. Analysis of scTCR and scBCR data 2: scRepertoire

scRepertoire in action



scRepertoire

Introduction

Single-cell sequencing is an emerging technology in the field of immunology and oncology that allows researchers to couple RNA quantification and other modalities, like immune cell receptor profiling at the level of an individual cell. A number of workflows and software packages have been created to process and analyze single-cell transcriptomic data. These packages allow users to take the vast dimensionality of the data generated in single-cell-based experiments and distill the data into novel insights. Unlike the transcriptomic field, there is a lack of options for software that allow for single-cell immune receptor profiling. Enabling users to easily combine RNA and immune profiling, the scRepertoire framework supports use of 10x, AIRR, BD, MiXCR, Omniscope, TRUST4, and WAT3R single-cell clonal formats and interaction with popular R-based single-cell data pipelines.



<https://www.borch.dev/uploads/screpertoire/>

scRepertoire in action

scRepertoire **2.3.4**

Getting Started

Install

Vignettes ▾

News/Changelog

Reference

FAQ

scRepertoire

Introduction

Single-cell sequencing is an emerging technology in the field, enabling researchers to couple RNA quantification and other modalities at the level of an individual cell. A number of workflows and software packages have been developed to analyze this data. These packages allow users to take the vast dimensions of single-cell data into novel insights. Unlike the transcriptomic field, the field of single-cell immune receptor profiling. Enabling users to easily combine RNA and immune receptor data from MiXCR, Omniscope, TRUST4, and WAT3R single-cell clonality analysis pipelines.

Applying Deep Learning to VDJ data

scRepertoire is compatible and integrated with the R packages [immunecore](#) for the T cell receptor and [lbex](#) for the B cell receptor. If you are interested in applying deep learning to your data, see [immApex](#).

Loading Data

Combining Contigs into Clones

Additional Processing

Basic Clonal Analysis

Visualizing Clonal Dynamics

Summarizing Repertoires

Clonal Diversity, Rarefaction, and Overlap

Clustering Sequences by Edit Distance

Combining Clones and Single-Cell Objects

Visualizations for Single-Cell Objects

Quantifying Clonal Bias

Making Deep Learning Models with immApex

Combining Deep Learning and TCRs with Trex

Combining Deep Learning and BCRs with lbex

Single-cell Gene Set Enrichment Analysis

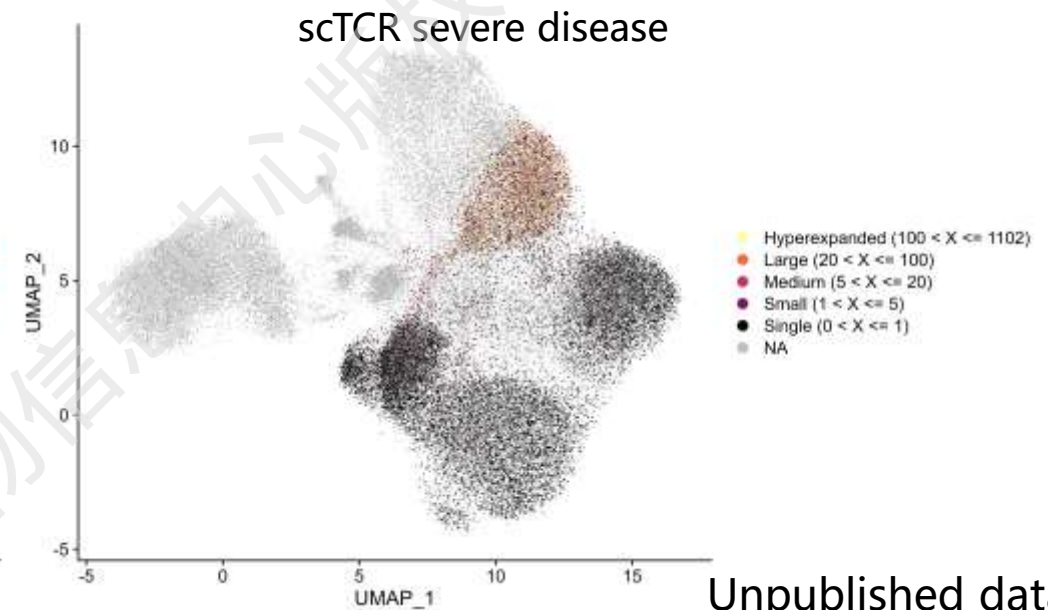
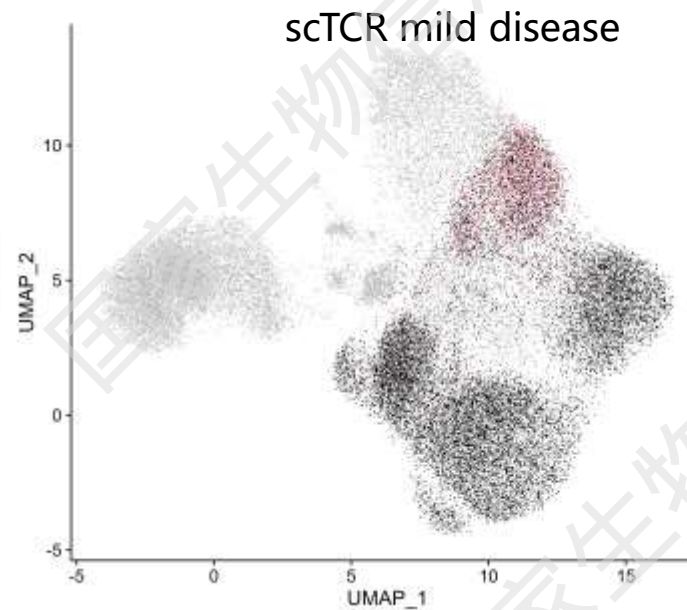
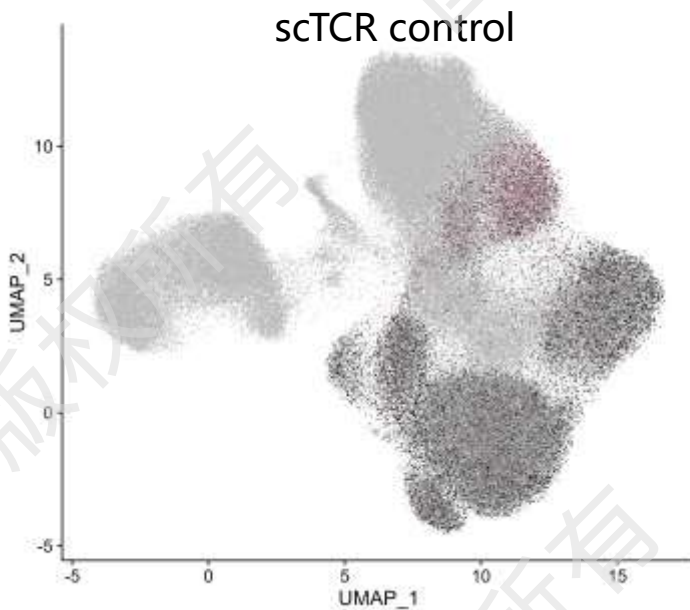
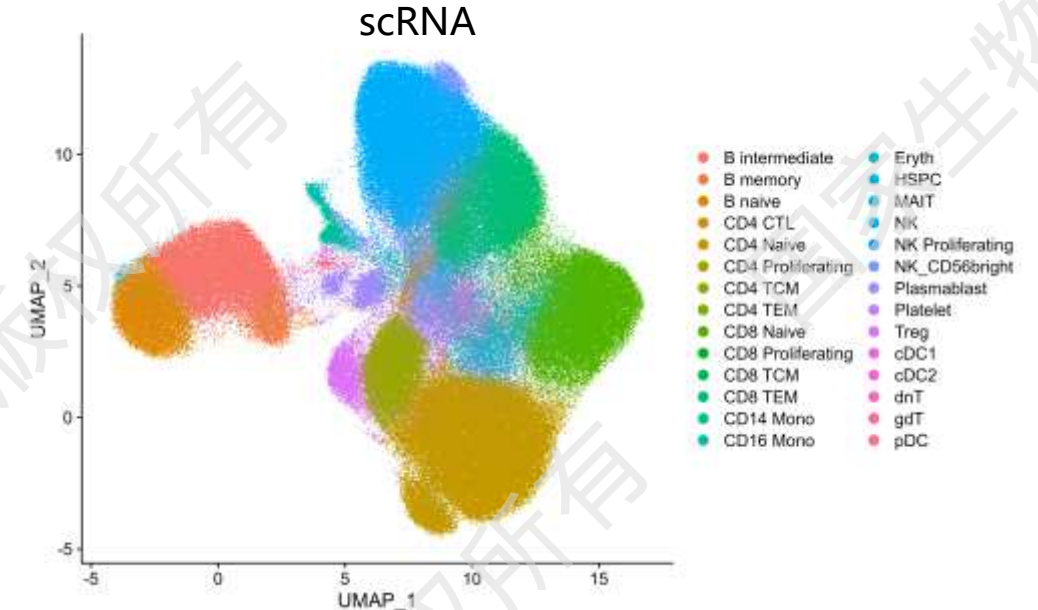


Single-cell transcriptomic experiments and distill the single-cell immune receptor data from 10x, AIRR, BD, and other single-cell data pipelines.

Decoding of the T cell immune receptors, please

Integration of scTCR/scBCR and scRNA data

Calculate the distribution of clonotypes with different abundances across various cell types (function: DimPlot): It was found that in healthy individuals, mild patients, and severe patients, the clonotypes with the highest frequency in each group were mainly located in CD8+ effector T cells (CD8 TEM). Moreover, as the severity of the disease increased, the abundance of clonotypes in all types of T cells generally rose gradually.

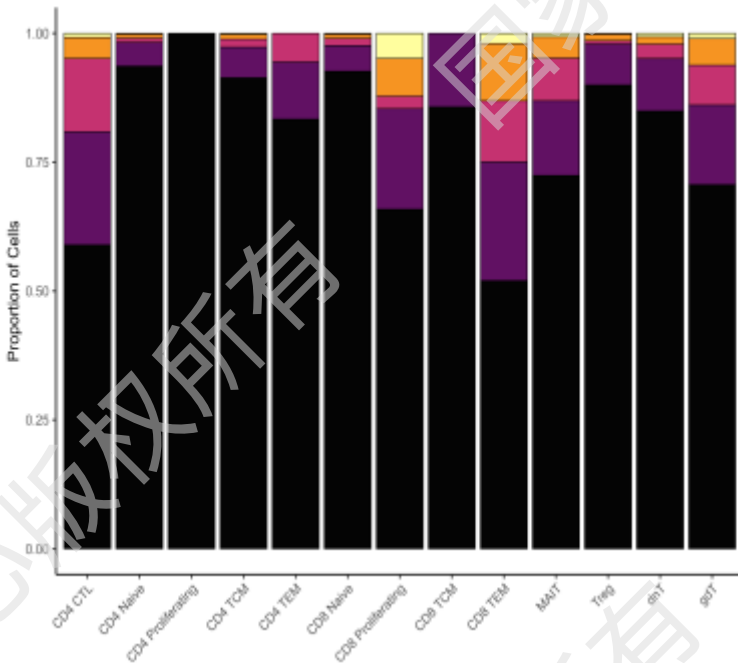


Unpublished data

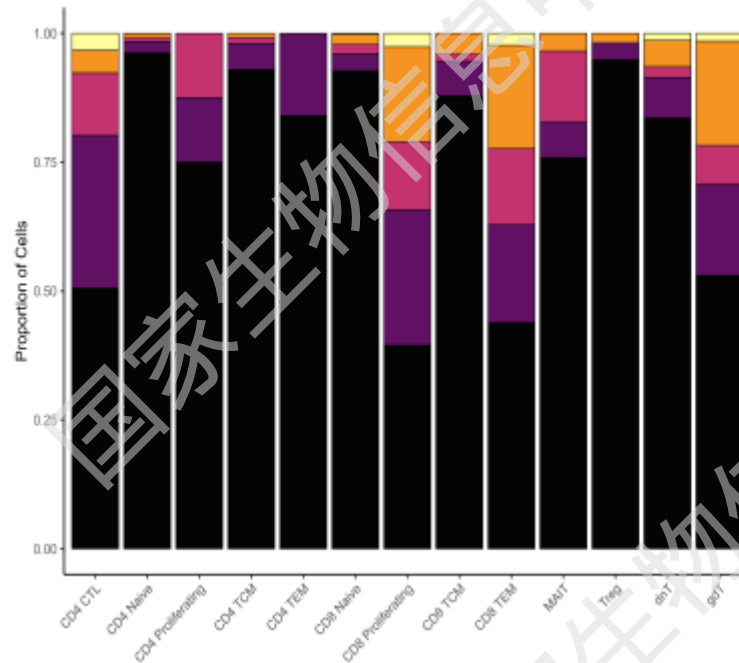
Integration of scTCR/scBCR and scRNA data

Use a stacked bar chart to calculate the proportion of clonotypes with different abundances in each cell type (function: clonalOccupy): As the disease severity increases, the abundance of clonotypes in all types of T cells generally rises gradually. The most significant changes are observed in CD4+ cytotoxic T cells (CD4 CTL), CD8+ proliferating T cells (CD8 Proliferating), CD8+ effector T cells (CD8 TEM), mucosal-associated invariant T cells (MAIT), and $\gamma\delta$ T cells (gdT).

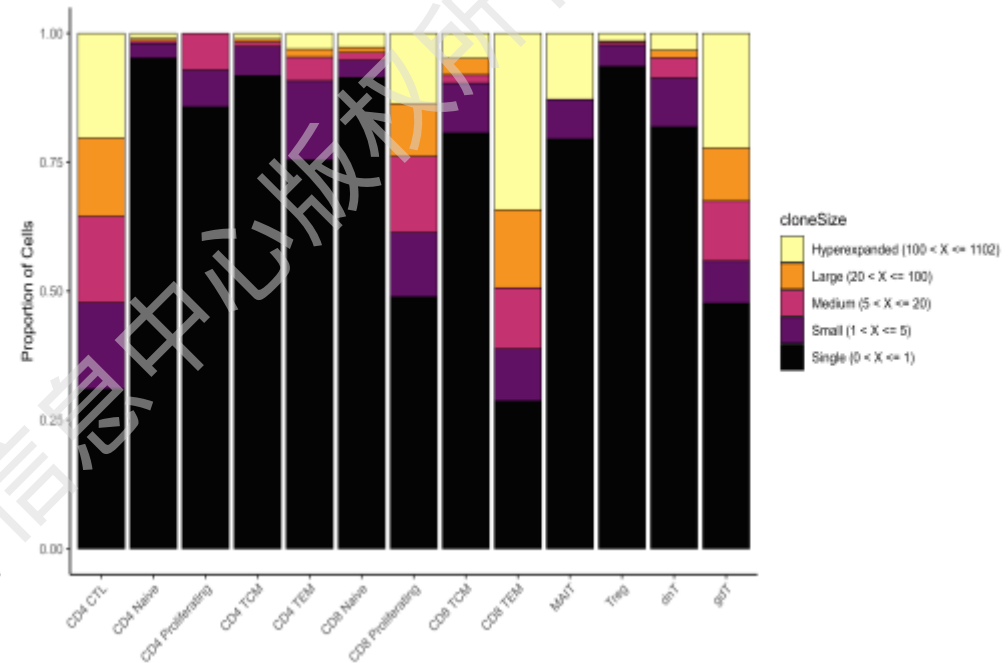
scTCR control



scTCR mild disease



scTCR severe disease



Thank you!

<http://jianglab.group>

