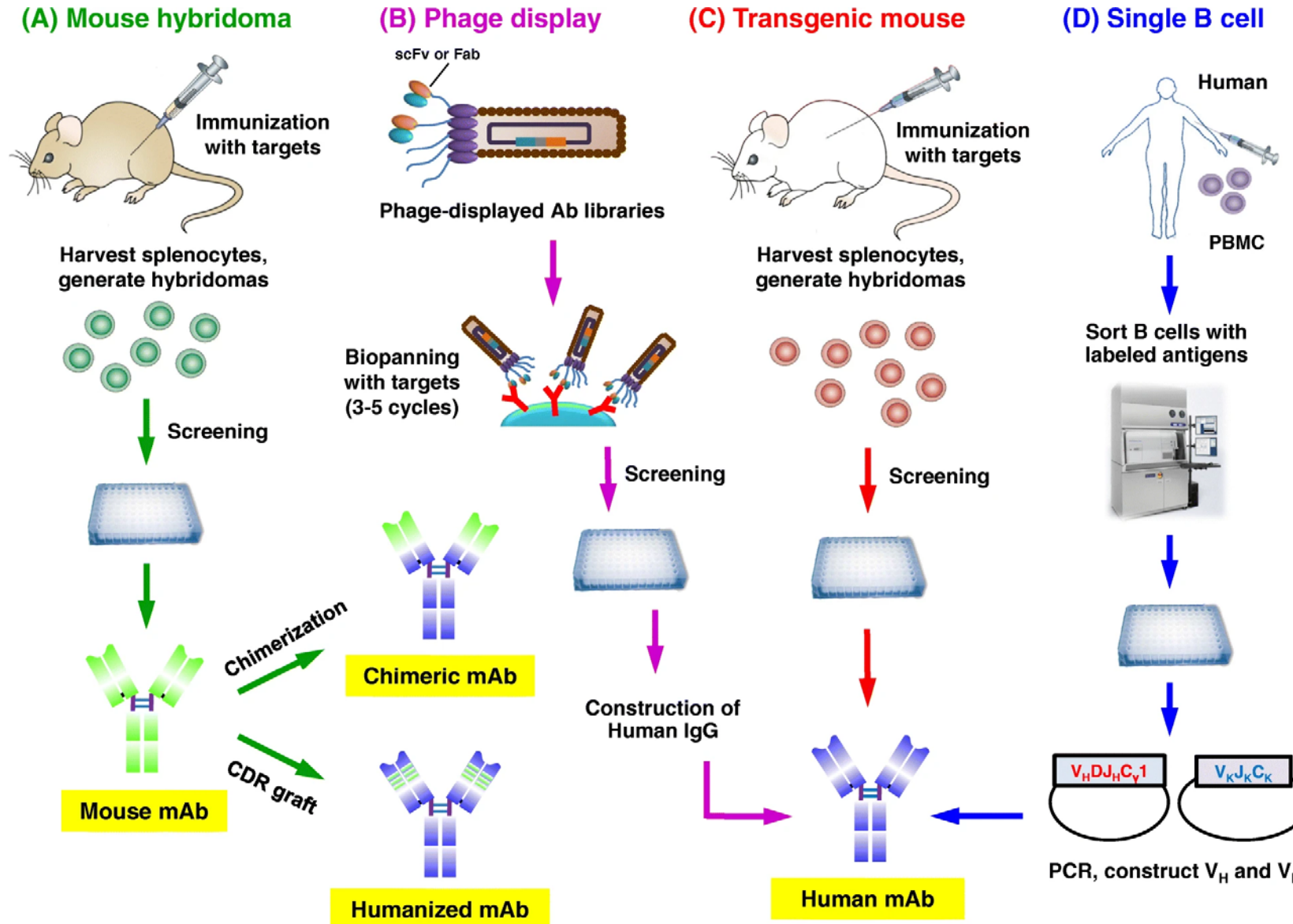


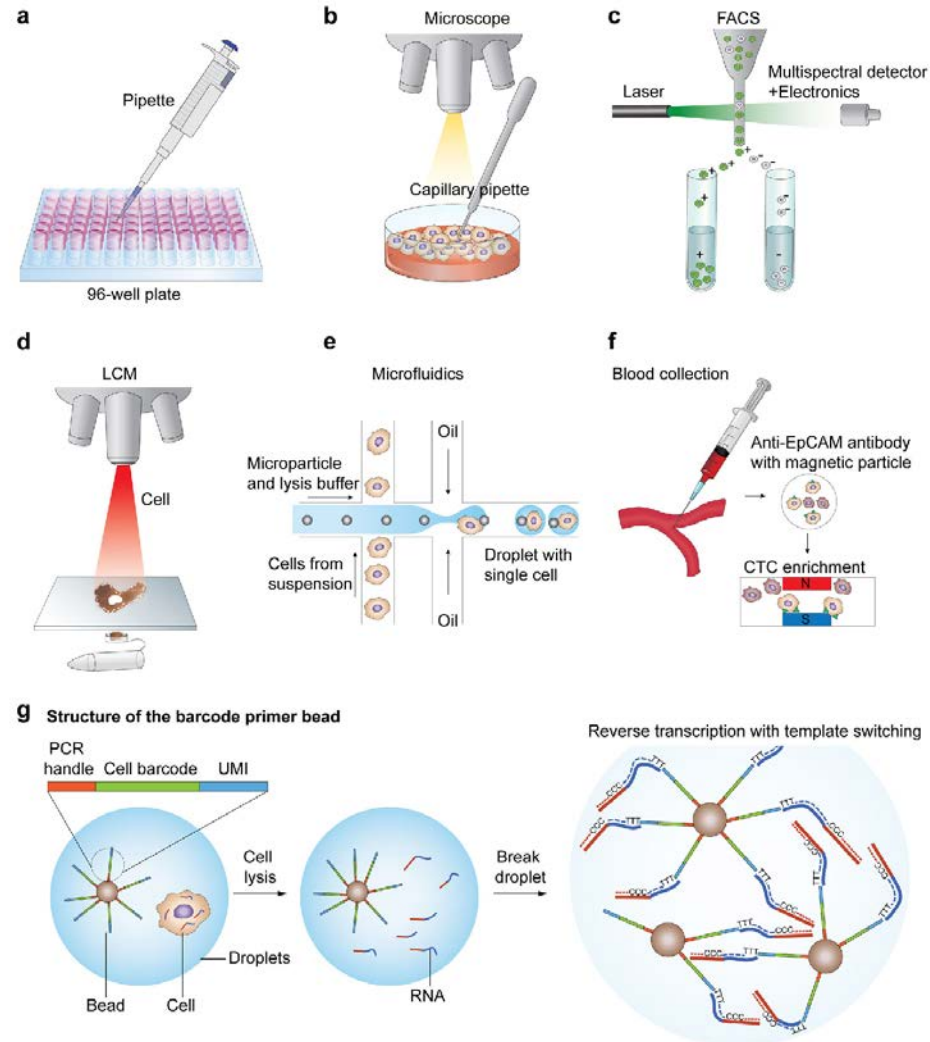
# Accelerating antibody discovery and vaccine development

Chryssa Zografou  
Technical Journal Club  
June 23 2020

# Traditional approaches to characterize antigen-specific B cells



# Advances in single-cell RNA sequencing have allowed for comprehensive analysis of the immune system



a The limiting dilution method.

b Micromanipulation involves collecting single cells using microscope-guided capillary pipettes.

c FACS isolates highly purified single cells by tagging cells with fluorescent marker proteins.

d Laser capture microdissection (LCM) utilizes a laser system aided by a computer system to isolate cells from solid samples.

e Microfluidic technology for single-cell isolation requires nanoliter-sized volumes.

f The CellSearch system enumerates CTCs from patient blood samples by using a magnet conjugated with CTC binding antibodies.

g A schematic example of droplet-based library generation.

# High-Throughput Mapping of B Cell Receptor Sequences to Antigen Specificity

Ian Setliff,<sup>1,2,16</sup> Andrea R. Shiakolas,<sup>1,3,16</sup> Kelsey A. Pilewski,<sup>1,3</sup> Aryn A. Murji,<sup>1,3</sup> Rutendo E. Mapengo,<sup>4</sup> Katarzyna Janowska,<sup>5</sup> Simone Richardson,<sup>4,11</sup> Charissa Oosthuysen,<sup>4,11</sup> Nagarajan Raju,<sup>1,3</sup> Larance Ronsard,<sup>7</sup> Masaru Kanekiyo,<sup>8</sup> Juliana S. Qin,<sup>1</sup> Kevin J. Kramer,<sup>1,3</sup> Allison R. Greenplate,<sup>1</sup> Wyatt J. McDonnell,<sup>3,9,17</sup> Barney S. Graham,<sup>8</sup> Mark Connors,<sup>10</sup> Daniel Lingwood,<sup>7</sup> Priyamvada Acharya,<sup>5,6</sup> Lynn Morris,<sup>4,11,12</sup> and Ivelin S. Georgiev<sup>1,3,13,14,15,18,\*</sup>

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# Introduction

## The problem...

For antibody development and vaccine production we want to identify:

1. B cells with antigen specificity
2. Information on the B cell receptor

Current techniques on antigen-specific B cells/BCR sequencing have some limitations:

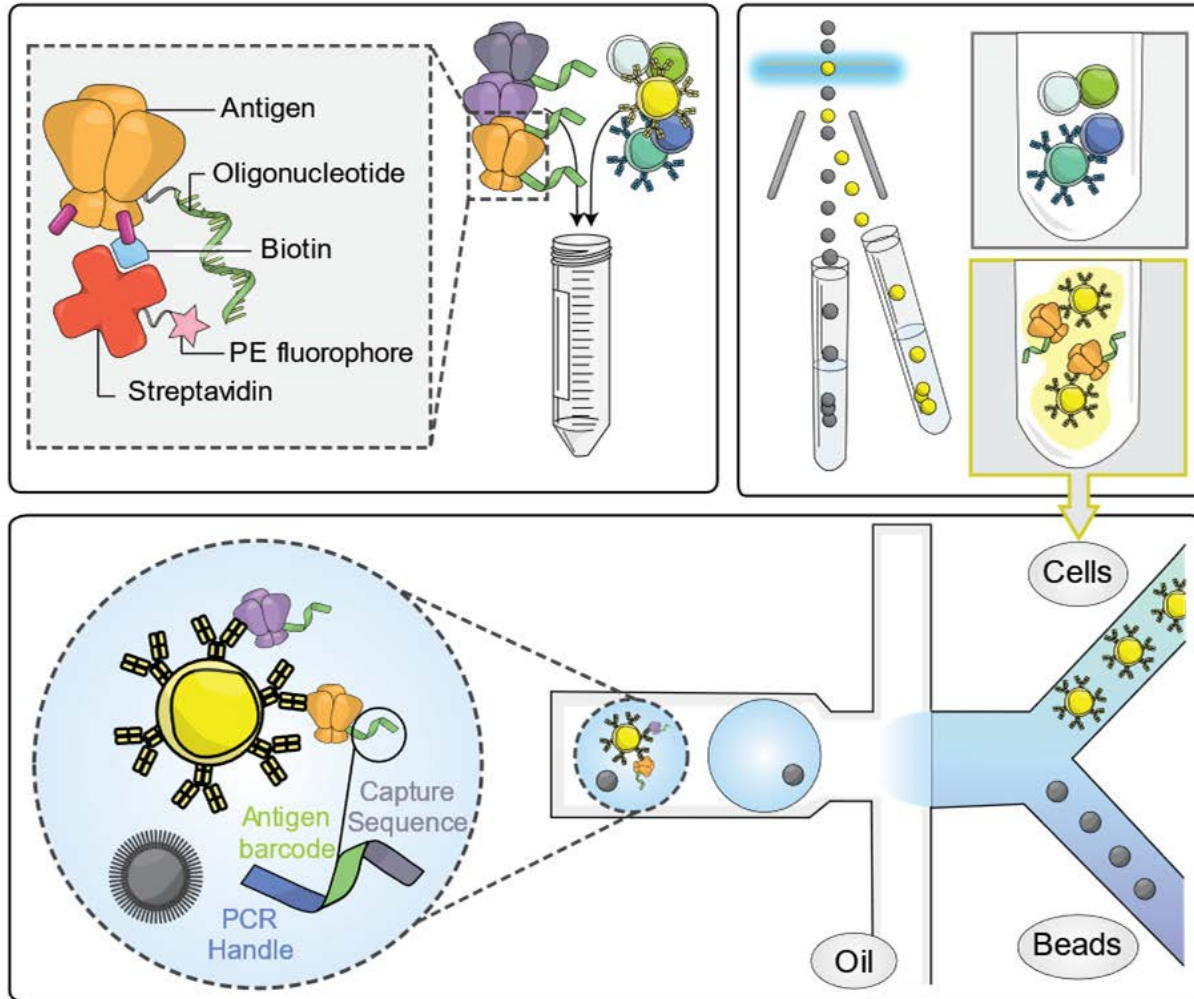
1. number of B cells
2. pairing of heavy and light
3. number of antigens that can be screened against
4. antigen specificity maps

## The solution to the problem...

Antigen-specific BCR sequencing can be combined with LIBRA-Seq  
**((Linking B cell receptor to antigen specificity))**



# Linking BCR sequences to antigen specificity via next-generation sequencing



- LIBRA-seq transforms antibody-antigen interactions into sequencing-detectable events by conjugating barcoded DNA oligos to each antigen in a screening library.
- All antigens are labeled with the same fluorophore, which enables sorting of antigen-positive B cells by fluorescence activated cell sorting (FACS) before encapsulation of single B cells via droplet microfluidics.
- Antigen barcodes and BCR transcripts are tagged with a common cell barcode from bead-delivered oligos, enabling direct mapping of BCR sequence to antigen specificity.

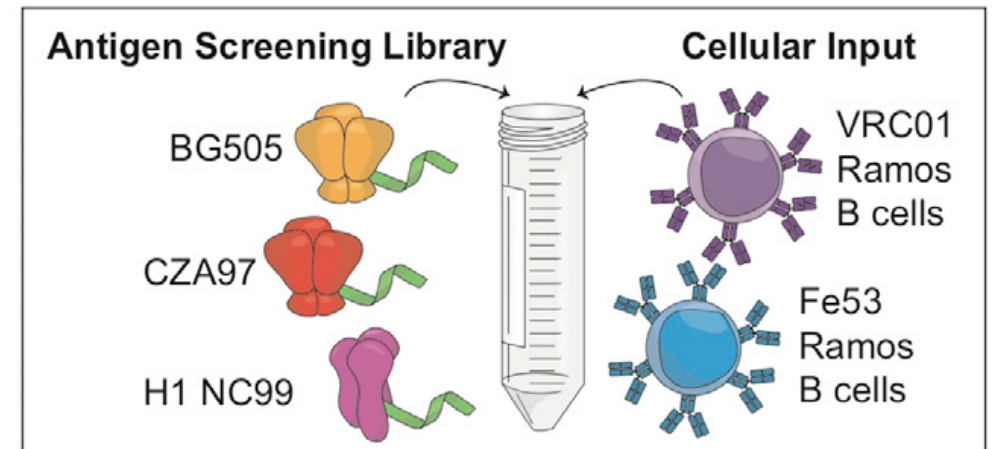
# Assay design

Ramos B cell line – express IgM and as B cell mutate they knock out IgM  
2 well characterized BCRs:

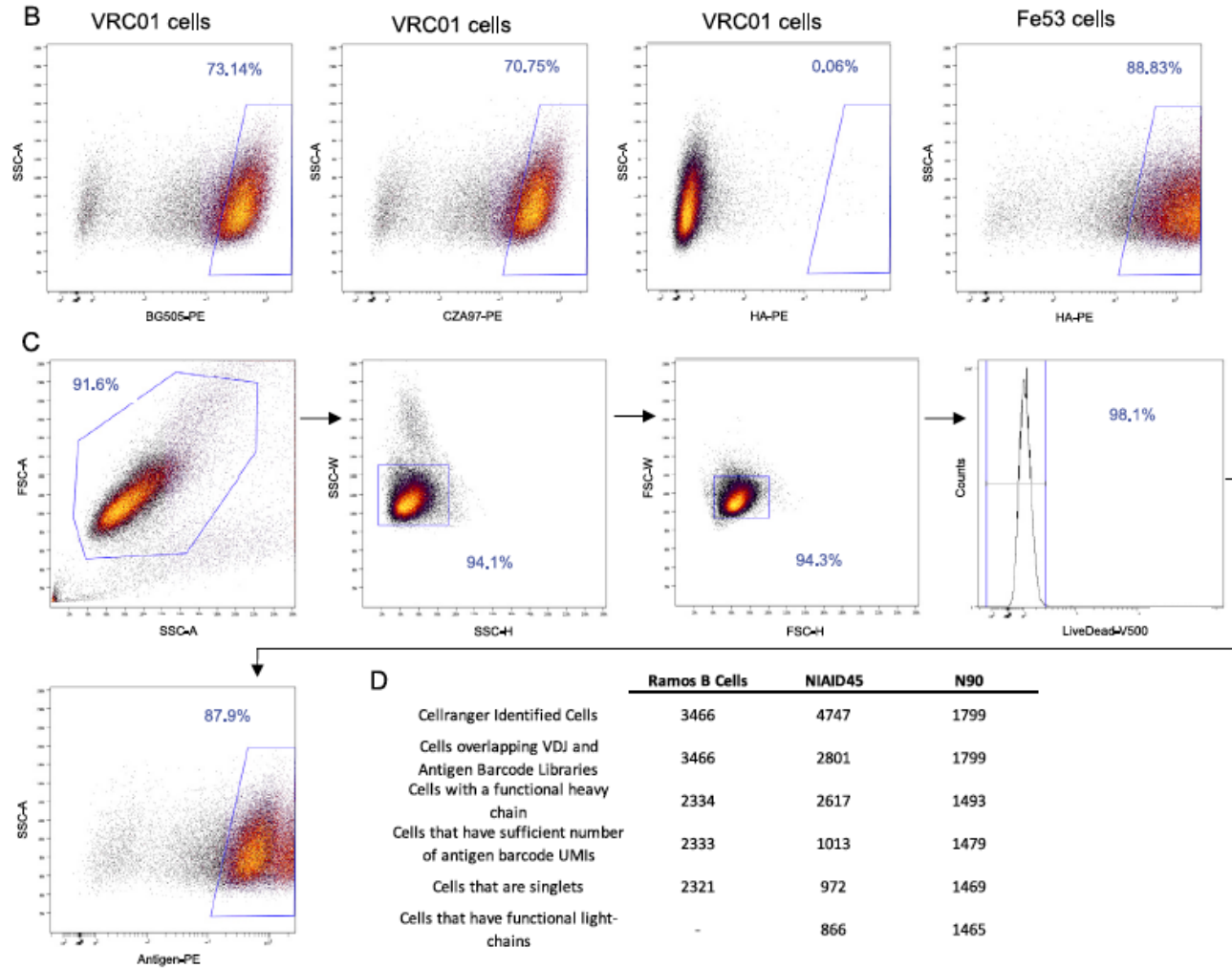
- VRC01, a CD4-binding-site-directed HIV-1 bNAb
- Fe53, a bNAb recognizing the stem of group1 influenza hemagglutinins (HAs)

B cell lines are mixed at a 1:1 ratio and incubated with three unique DNA-barcoded antigens:

1. two stabilized trimeric HIV-1 Env proteins (SOSIP) from strains **BG505** and **CZA97**
2. trimeric HA from strain H1 A/New Caledonia/20/1999, **H1 NC99**



# Gating scheme for FACS sorting of Ramos B cell lines

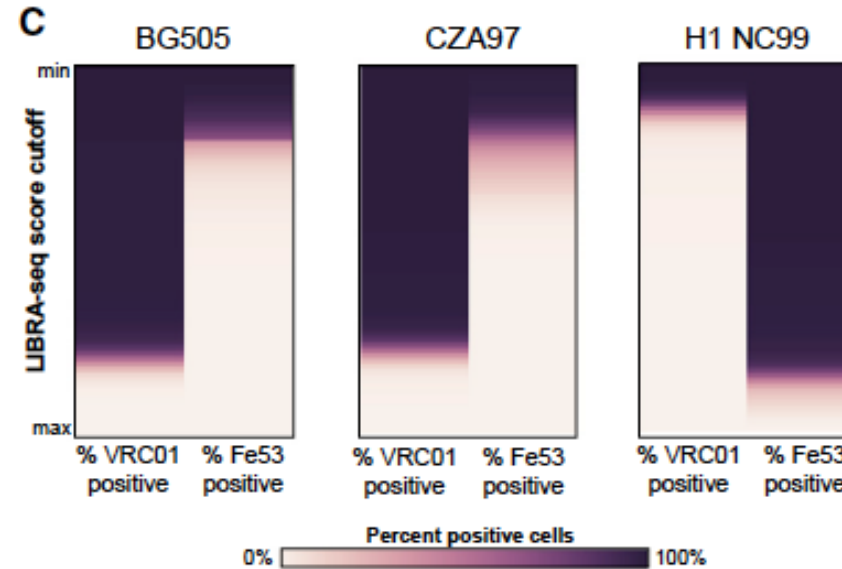


- 2,321 cells with BCR sequence and antigen mapping information were recovered
- VRC01 Ramos B cells bound both BG505 and CZA97 with a high correlation between the scores for these two antigens (Pearson's  $r = 0.84$ )

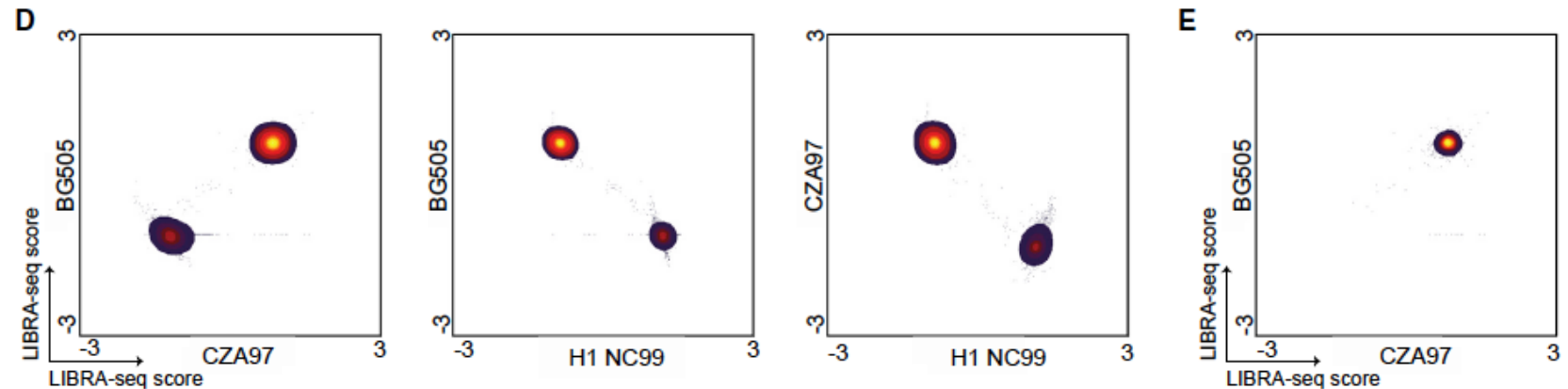


# LIBRA-seq binding scores for each antigen

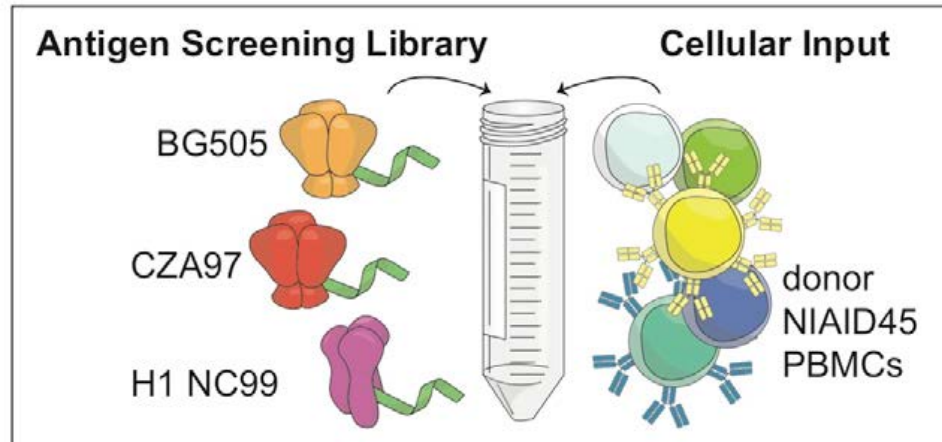
- Scores were computed as a function of the number of unique molecular identifiers (UMIs) for the respective antigen barcode
- All counts of 1, 2, or 3 UMIs were set to 0, and set to contain only cells with a count of at least 4 UMIs for at least 1 antigen.



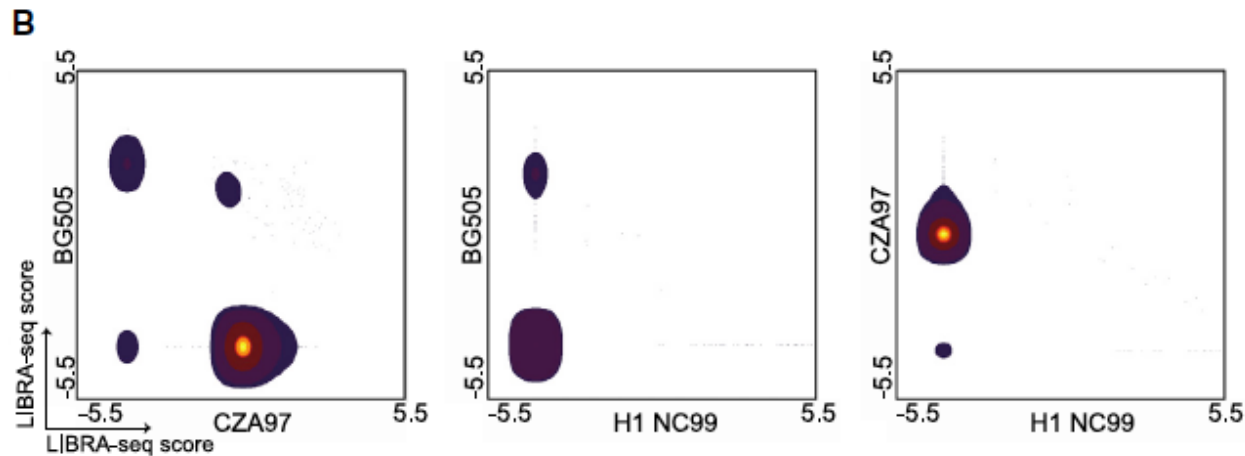
Scores for each pair of antigens were plotted



# Antibodies from an HIV bNAb donor NIAID45



Same approach:  
BG505, CZA97, and H1 NC99  
antigen screening library  
Recovered paired VH:VL antibody  
sequences with antigen mapping for  
866 cells

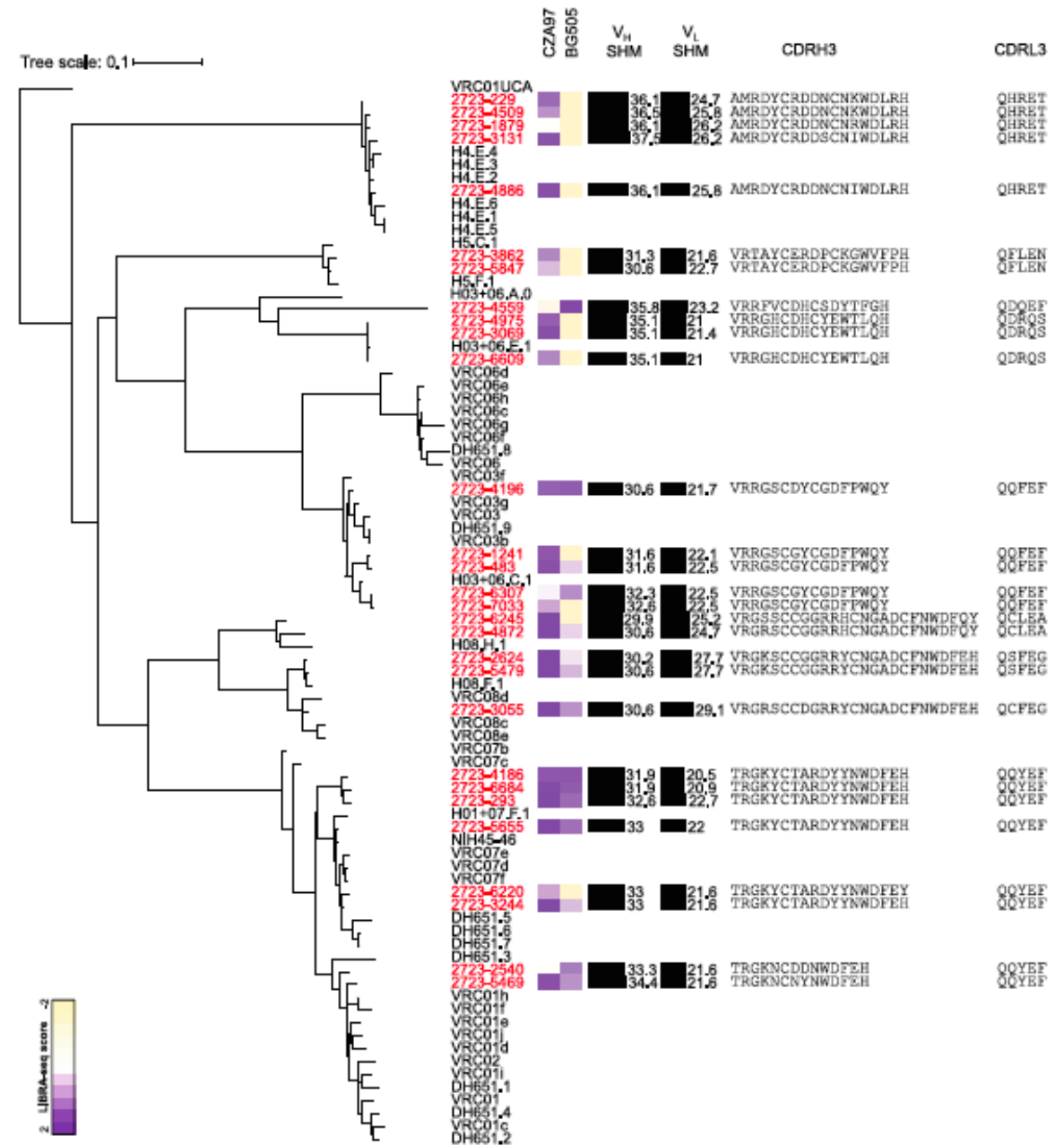


Different patterns of LIBRA-Seq scores:  
cross reactive B cells to BG505 and CZA97

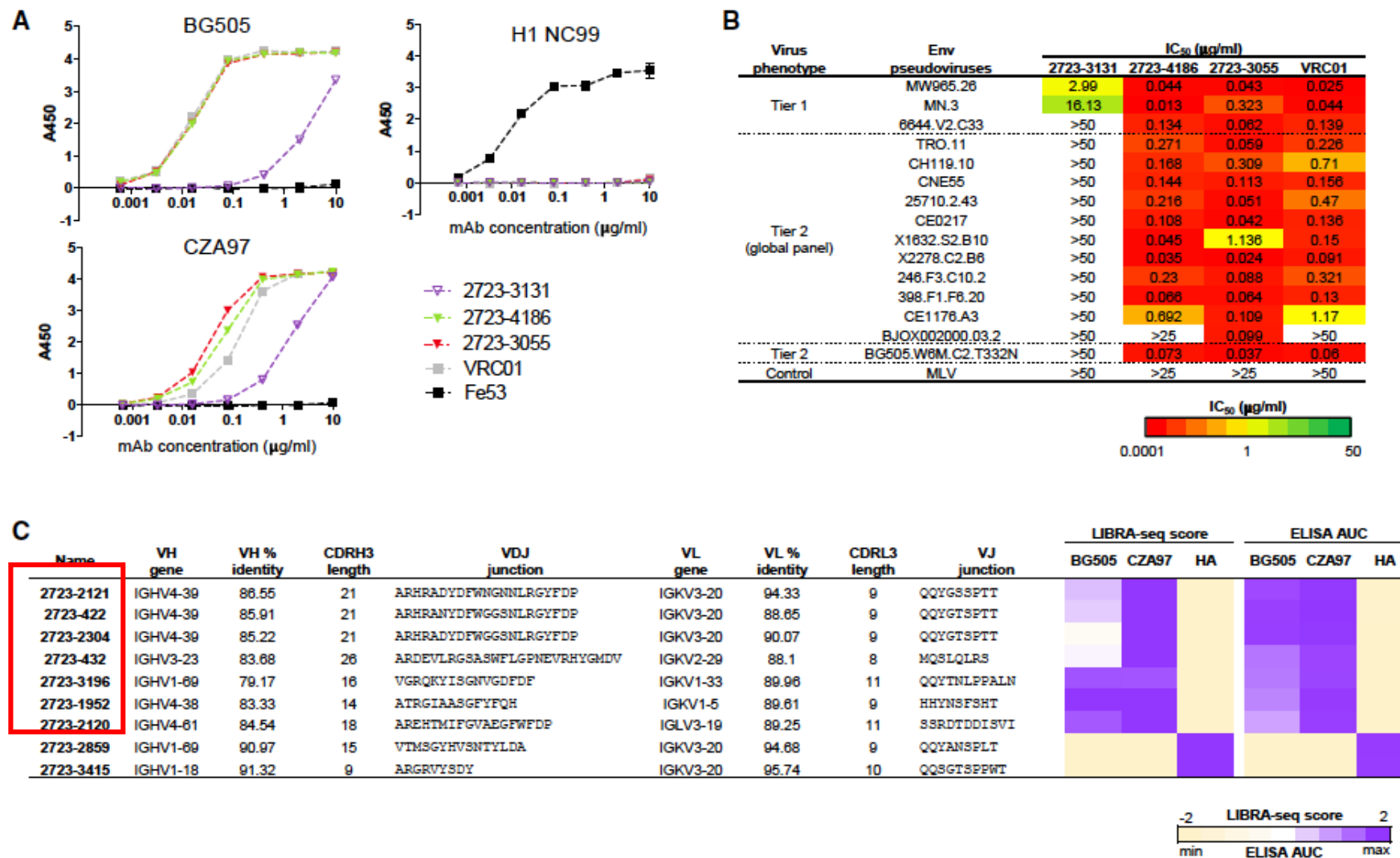
# Validating the utility of LIBRA-seq in monoclonal antibody isolation

- A large lineage of HIV-1 bNAbs had been identified previously from donor NIAID45
- This lineage consists of the prototypical bNAb VRC01 as well as multiple clades of clonally related antibodies with diverse neutralization phenotypes
- Compared LIBRA-seq members to the ones from the VRC01 antibody lineage
- Found **29 BCRs** that were clonally related to previously identified members of the VRC01 lineage

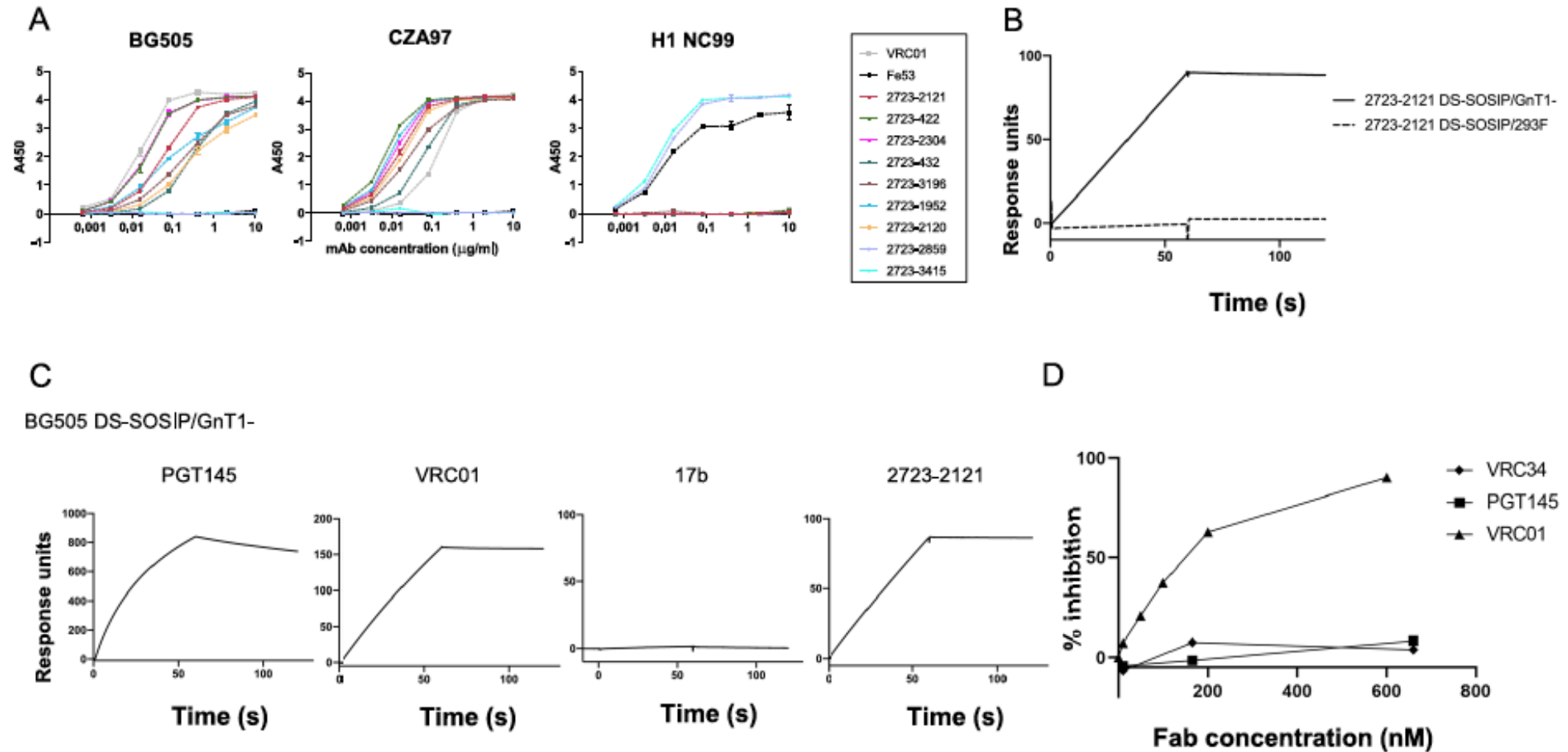
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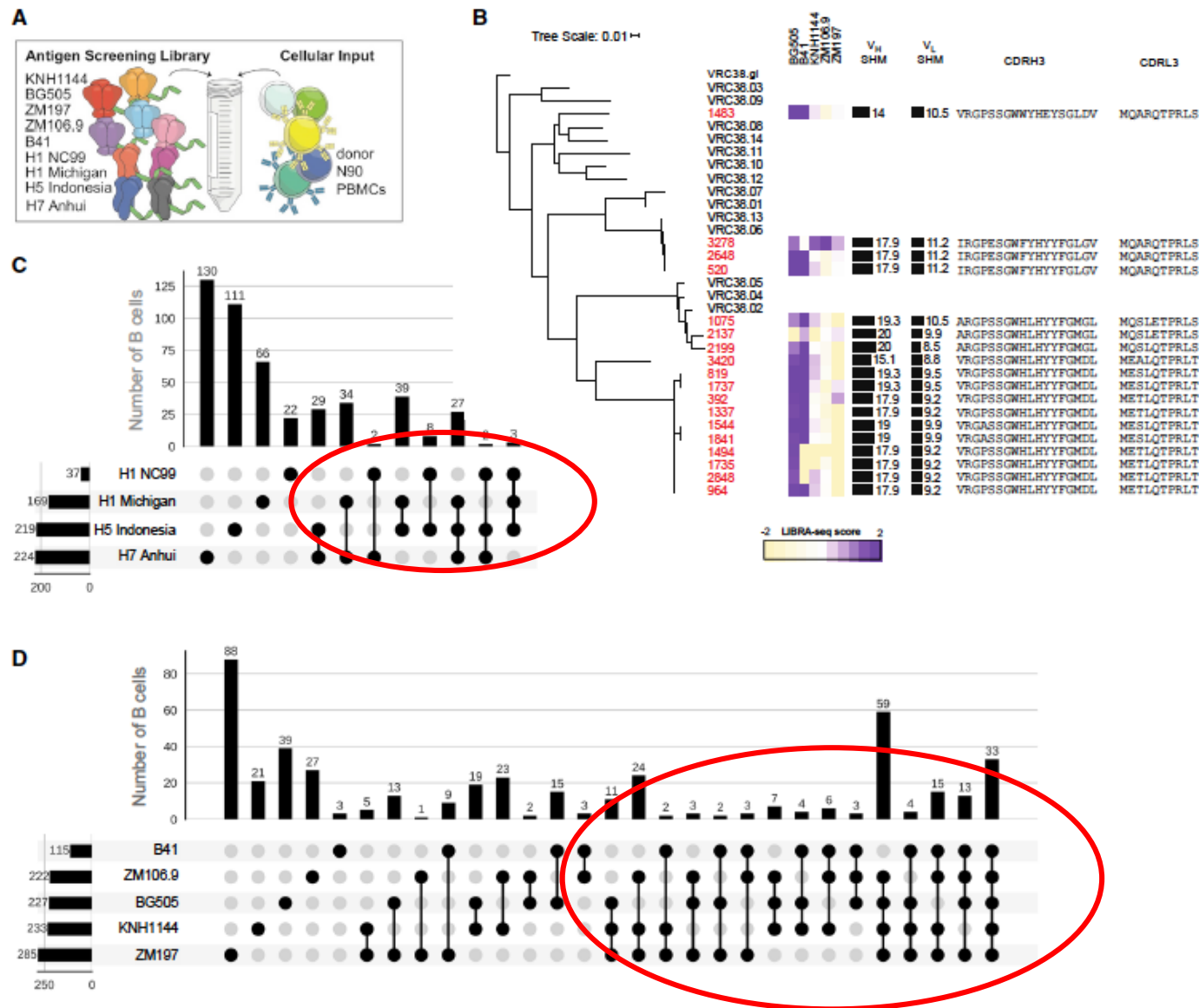
# Characterization of LIBRA-seq-identified antibodies from donor NIAID45



# Characterization of LIBRA-seq-identified antibodies from donor NIAID45



# Discovery of an HIV bNAb from donor N90 using an antigen screening library



- Increased the number of antigen to 9:
- Recovered paired VH:VL antibody sequences with antigen mapping for 1,465 cells
- Antigen specificity maps:  
Number of B cells with high scores
- 17 had high LIBRA-seq scores for at least one HIV antigen, and one had no high LIBRA-seq scores but had a mid-range score for two SOSIPs
- 32 cells that had high LIBRA-seq scores for three of the four influenza antigens

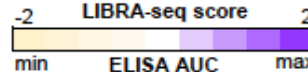


# Discovery of an HIV bNAb from donor N90 using an antigen screening library

- 3602-870 is highly mutated 29% deviation from the germline in the heavy chain and 17% deviation from the light chain
- 3602-1707 mAb has broad influenza recognition, with high correlation between LIBRA-seq scores and ELISA

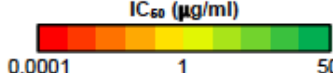
**A**

Name	VH gene	VH % identity	CDRH3 length	VDJ junction	VL gene	VL % identity	CDRL3 length	VJ junction		BG505	B41	KNH1144	ZM106.9	ZM197	H1 NC99	H5 Indonesia	H1 Michigan	H7 Anhui
3602-870	IGHV1-46	71.53	19	ARDAGERGLRGYSVGFFDS	IGKV3-20	82.98	9	HQYGTTPYT	LIBRA-seq score									
									ELISA AUC									
3602-1707	IGHV3-23	87.15	24	AKVVAGGQLRYFDWQEGHYGMDV	IGKV2-28	96.60	9	MQSLQTPHS	LIBRA-seq score									
									ELISA AUC									

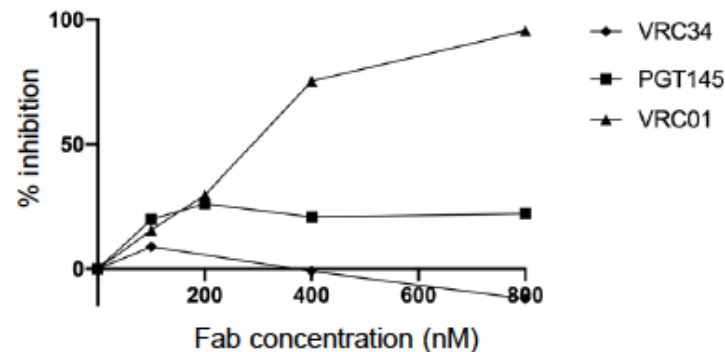


**B**

Virus phenotype	Env-pseudoviruses	IC <sub>50</sub> (μg/ml)
Tier 2 (global panel)	TRO.11	0.18
	CH119.10	0.58
	CNE55	>10
	25710.2.43	0.33
	CE0217	0.19
	X1632.S2.B10	>10
	X2278.C2.B6	0.06
	246_F3.C10.2	0.78
	398.F1.F6.20	>10
	CE1176.A3	0.76
Tier 2	BJOX002000.03.2	0.16
	CZA97	1.41
	ZM197	4.94
	BG505.W6M.C2.T332N	0.13
Control	MLV	>10



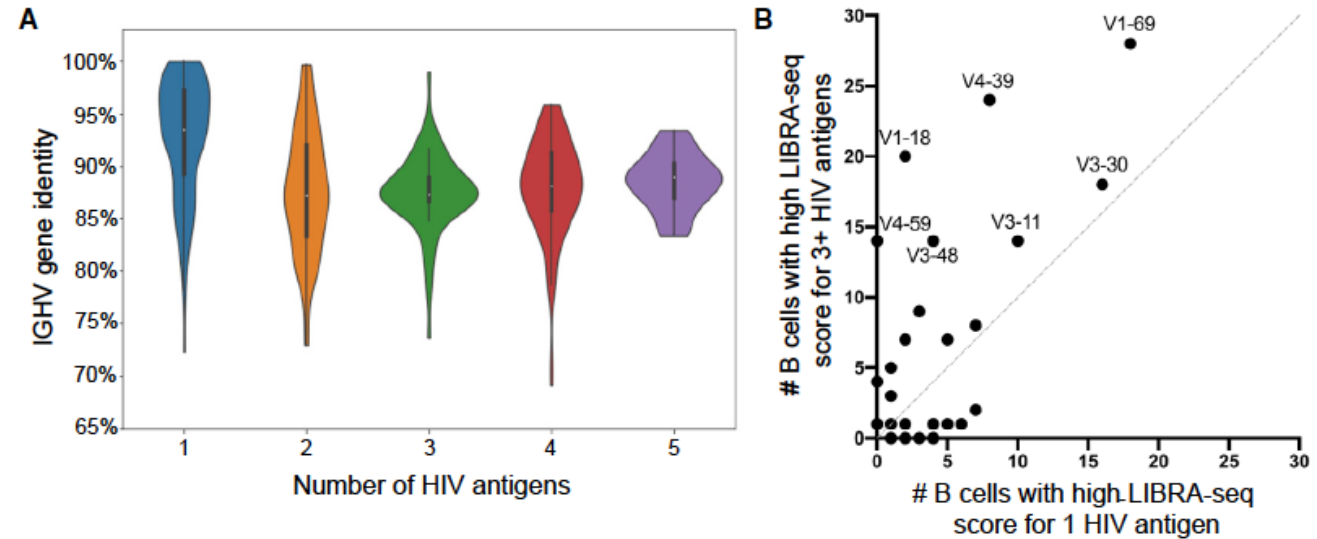
**C**



# LIBRA-Seq method

## Conclusions

- Detection of increased SHM in B cells with high scores for a single antigen compared to others with >1 antigen
- type-specific antibodies have lower levels of SHM
- Use of specific germline genes to be more frequent in B cells that exhibited broad as opposed to strain-specific HIV-1 antigen reactivity



- Novel method for interrogating antibody-antigen interactions via sequencing-based readouts:
  1. Antibody sequence
  2. Antigen reactivity
- Platform for simultaneously screening B cell repertoires against multiple diverse antigen targets
- Coupling of antibody sequence and specificity can enable high-resolution immune profiling; highly important for vaccine development

[J Clin Invest.](#) 2019 Jan 2; 129(1): 93–105.

PMCID: PMC6307935

Published online 2018 Nov 19. doi: [10.1172/JCI121341](#)

PMID: [30457979](#)

## Spec-seq unveils transcriptional subpopulations of antibody-secreting cells following influenza vaccination

[Karlynn E. Neu](#),<sup>1,2</sup> [Jenna J. Guthmiller](#),<sup>2</sup> [Min Huang](#),<sup>2</sup> [Jennifer La](#),<sup>3</sup> [Marcos C. Vieira](#),<sup>4</sup> [Kangchon Kim](#),<sup>4</sup>  
[Nai-Ying Zheng](#),<sup>2</sup> [Mario Cortese](#),<sup>5</sup> [Micah E. Tepora](#),<sup>1</sup> [Natalie J. Hamel](#),<sup>1</sup> [Karla Thatcher Rojas](#),<sup>2</sup> [Carole Henry](#),<sup>2</sup>  
[Dustin Shaw](#),<sup>1,2</sup> [Charles L. Dulberger](#),<sup>6</sup> [Bali Pulendran](#),<sup>5</sup> [Sarah Cobey](#),<sup>4</sup> [Aly A. Khan](#),<sup>7</sup> and [Patrick C. Wilson](#)<sup>1,2</sup>

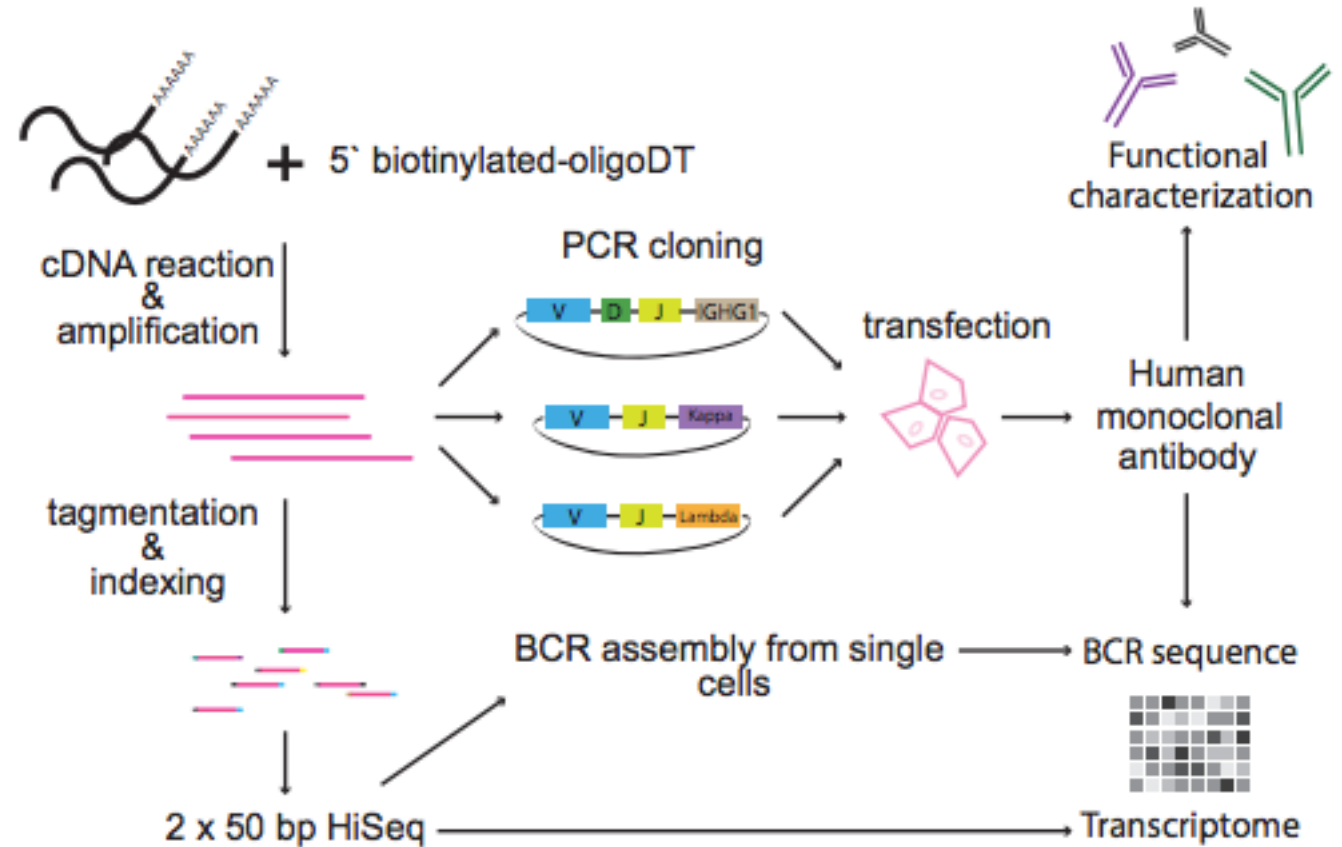
# The Spec-Seq framework

mAb characterization and  
transcriptional profiling from the same single B cell

*Spec-seq allows for simultaneous analysis of B cell receptor sequence, receptor binding properties and transcriptional profile from a single cell.*

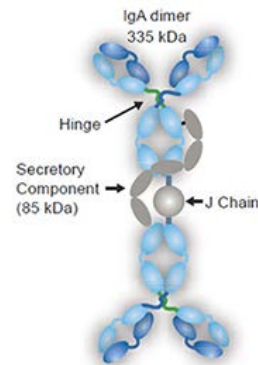
- RT-PCR & cDNA reaction
- Amplification with PCR and SmartSeq2 protocol
- The amplified V(D)J sequence is cloned into an expression vector, matched heavy and light chains are transfected into HEK293A cells and a fully human monoclonal antibody is generated
- Indexed libraries are generated from 0.5 ng of the remaining cDNA prior to next generation sequencing.

a



# Introduction

- Plasmablasts are the main ASCs in the peripheral blood and are thought to be terminally differentiated and short-lived
- Present at a low level in the peripheral blood of healthy humans and undergo significant expansion 7 days after immunization or infection
- The vaccine-induced population is predominantly antigen-reactive
- The majority of plasmablasts induced by vaccination express the IgG isotype, although produce IgA
- Steady-state plasmablast population comprises mainly of IgA
- IgA antibodies have enhanced neutralization capacity and antigen sequestration
- Shared IgA antibody sequences found in both the serum and the gut



an ideal target population for vaccines aimed to induce localized mucosal protection

# Exploring the immune transcriptome through Spec-Seq

Developed to explore plasmablast transcriptional diversity in the context of BCR repertoire and antigen specificity

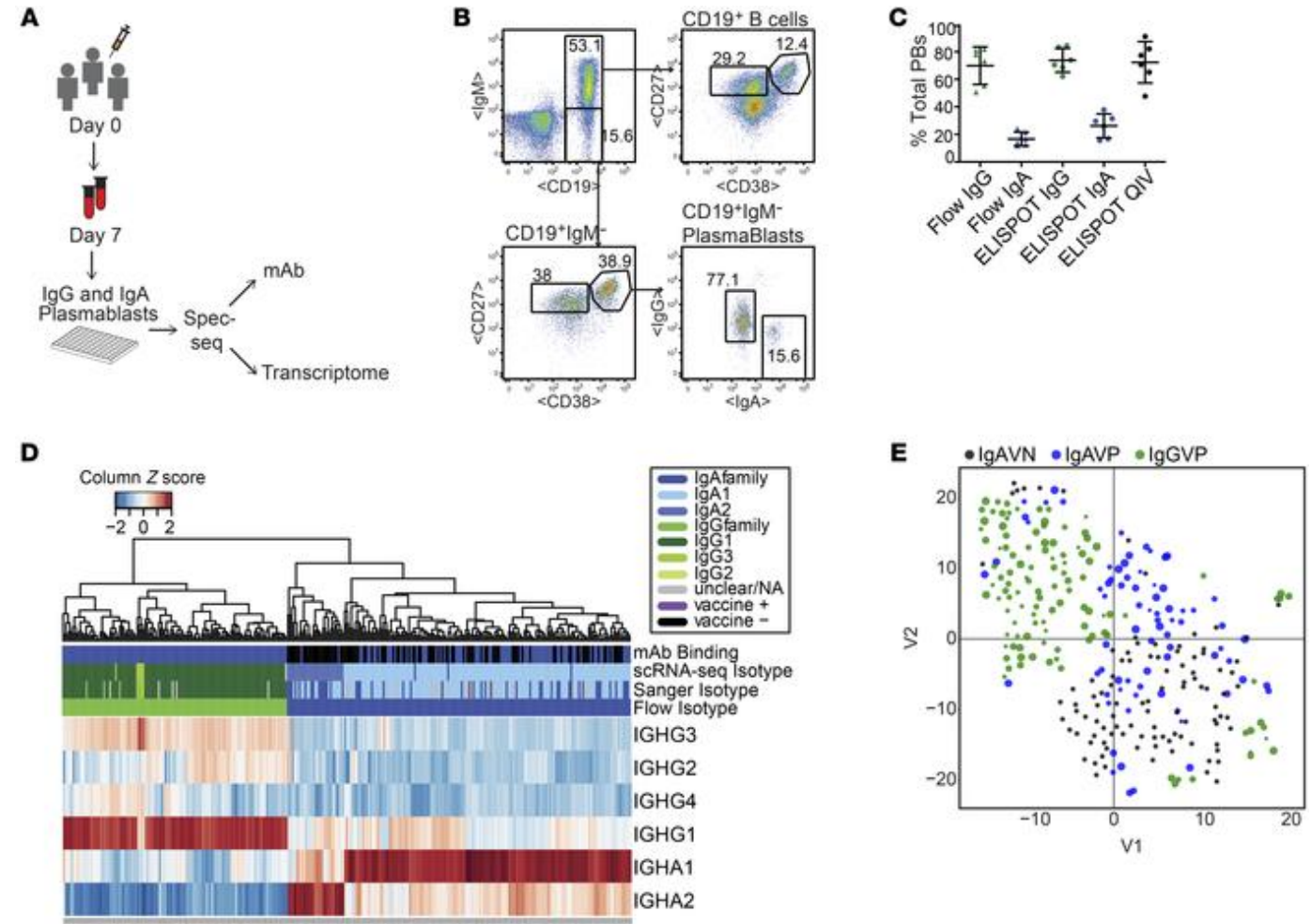
- How is BCR isotype or specificity affecting the transcriptome?
- Do these features affect other specializations than the BCR?
- How IgA vaccine-positive compare to IgG positive and IgA negative populations?
- Can transcriptional subpopulations correlated with BCR binding be identified?



# Exploring the immune transcriptome through Spec-Seq

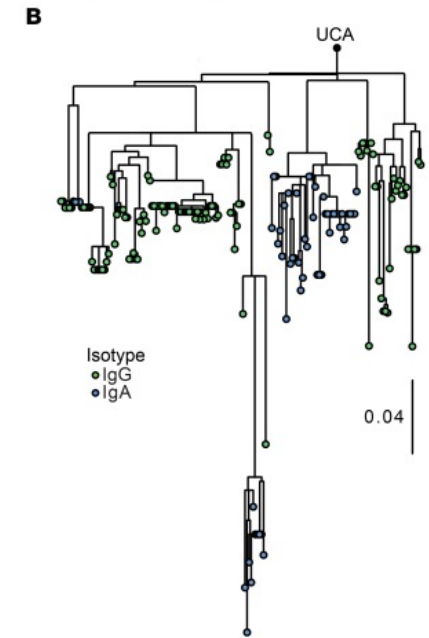
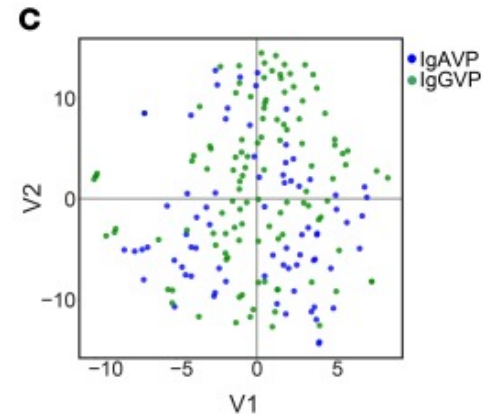
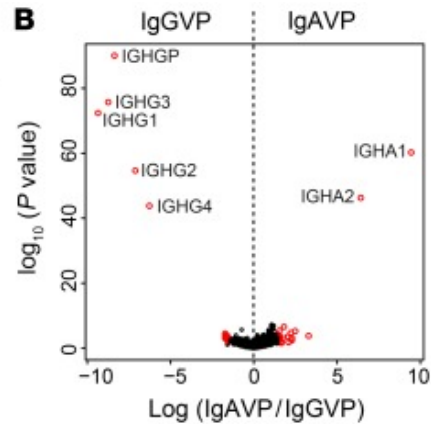
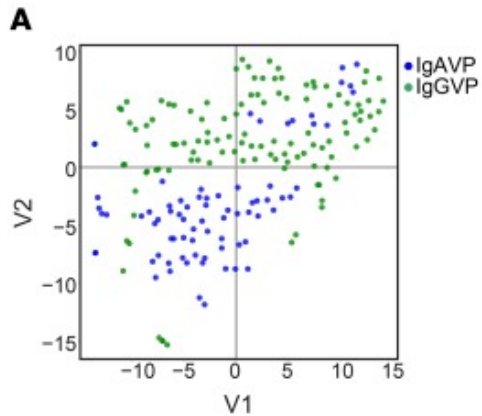
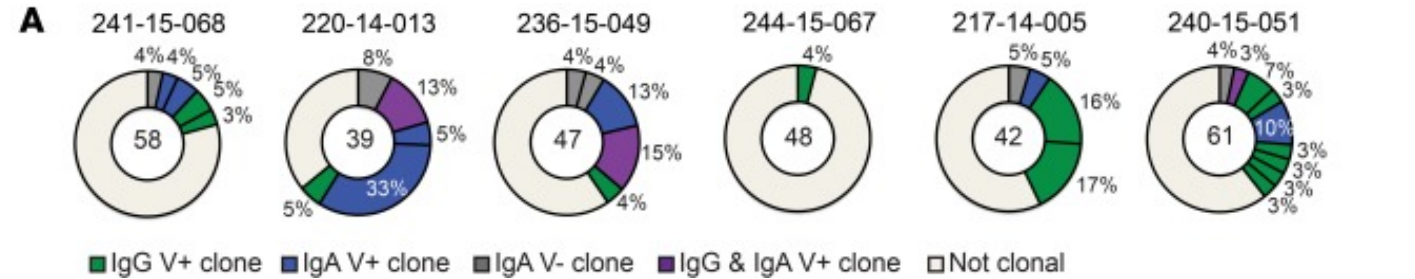
- IgA and IgG peripheral blood plasmablasts were single-cell sorted from 6 donors 7 days post- influenza vaccination

- Gating strategy from IgM- to IgG and IgA positive
- Plasmablast expansion post-vaccination
- Heatmap of 291 single-cells clustered by the expression of IgA/G subtype genes
- The IgAVP and IgAVN cells cluster together and away from the IgGVP population

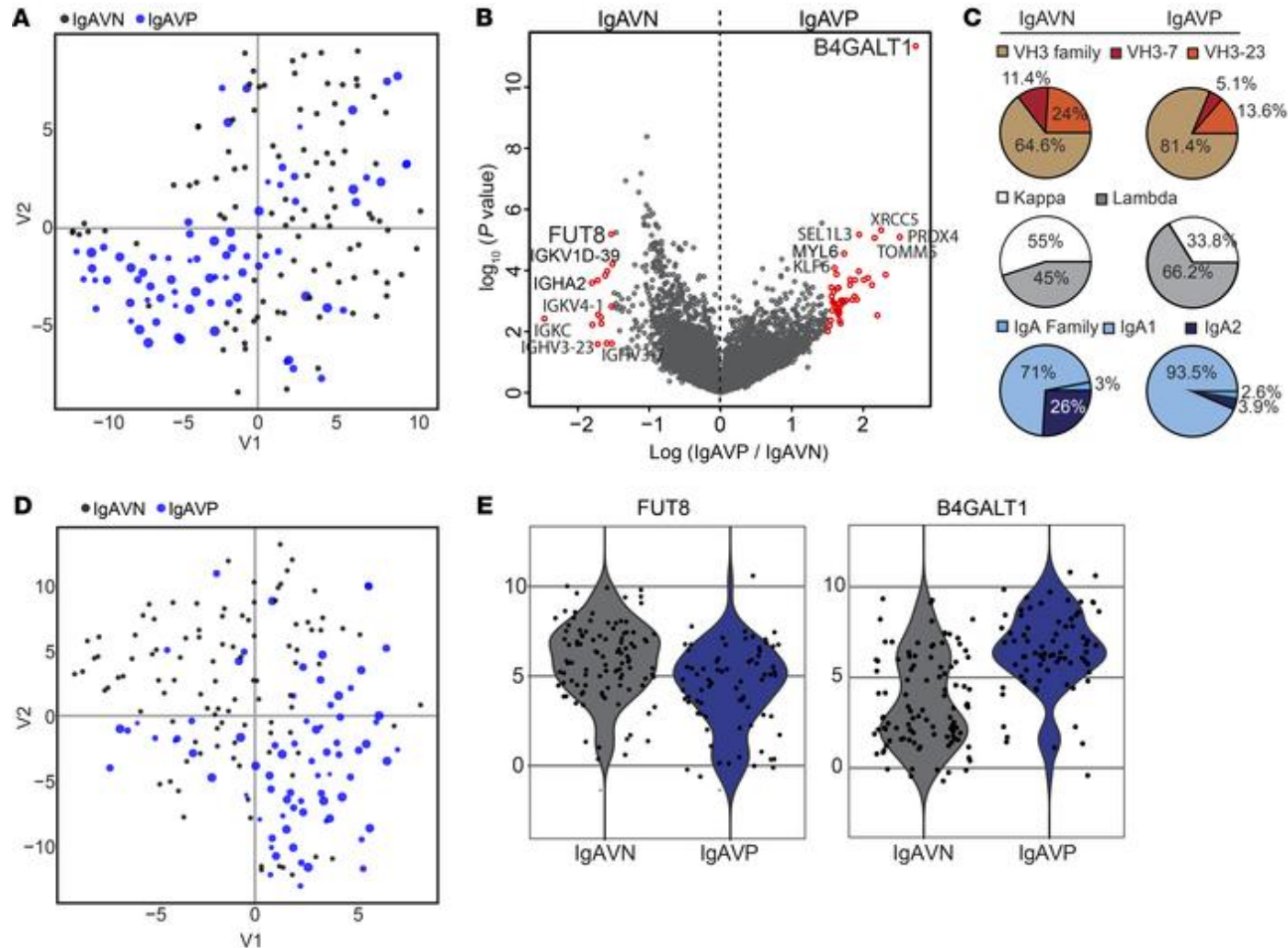


# Exploring the immune transcriptome through Spec-Seq

- Clonal expansions by donor
- Lineage tree reveals increased transcriptional similarities
- Frequency of clones containing both IgG and IgA members for the 3 donors



# IgA plasmablasts cluster by their vaccine-binding properties

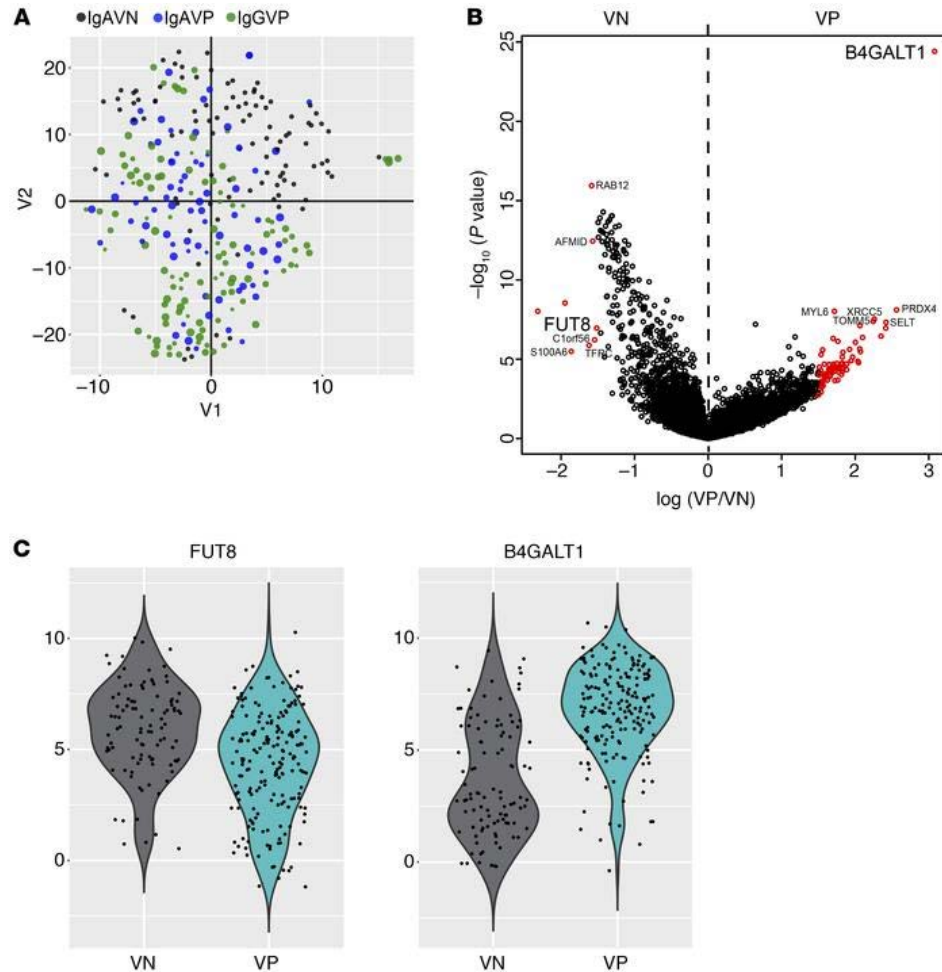


tSNE projection of the IgA cells suggests transcriptional segregation between these 2 populations -- could this indicate different functional properties or specificity for epitopes?

tSNE repeated without Ig genes and similar clustering indicate that transcriptional differences exist beyond repertoire usage

Differentially expressed genes identified are involved in glycosylation, affecting binding properties of BCR and altering immunogenicity

# Total plasmablasts cluster similarly

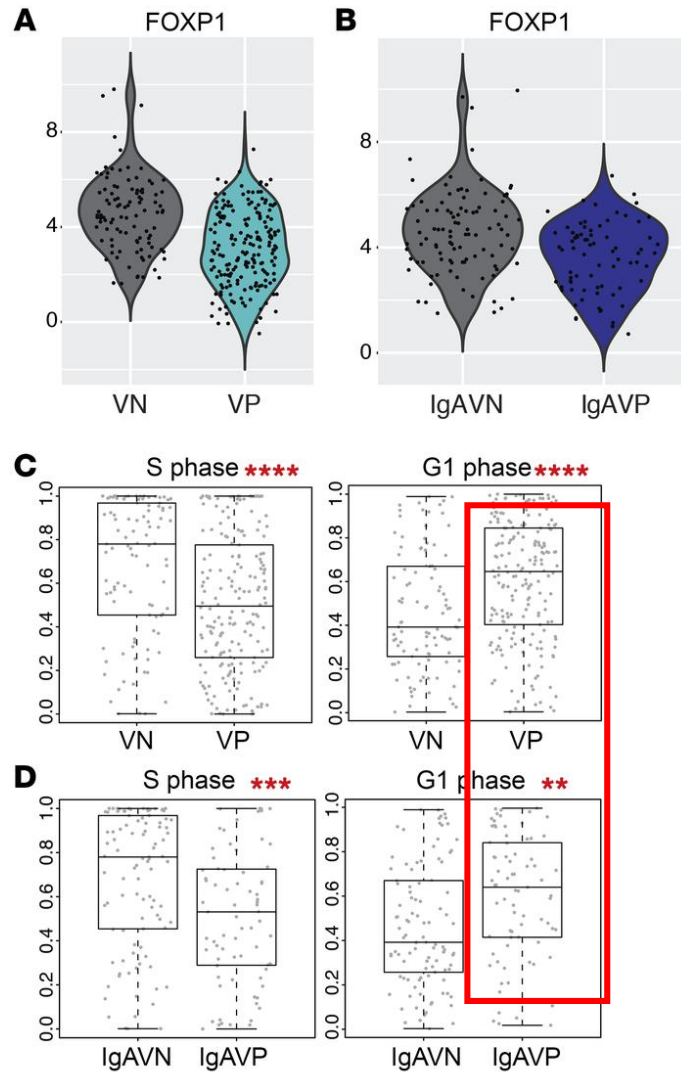


- IgGVP and IgAVP cells cluster together and away from the IgAVN cells
- Glycosylation genes are identified in large numbers between VN and VP cells

*plasmablast BCR specificity directs transcriptional differences that can ascribe key effector properties to the antibodies secreted by that cell*



# FOXP1 is differentially expressed between VN and VP cells



The increased expression of *FOXP1* within the vaccine-negative plasmablast population may suggest upregulation of pathways designed to prevent terminal differentiation into traditional antigen-induced plasmablasts

G1 phase increase in VP cells indicates terminal differentiation into antibody-secreting cells

# Spec-Seq method

## Conclusions

- B cell biology is linked to BCR specificity; somatically rearranged receptors provide distinct antigen specificities and effector functions
- Vaccine-induced plasmablasts are transcriptionally distinct from the vaccine-negative IgA population
- Identification of dominant BCR transcripts is not surprising
- No significant changes in the gene expression profiles of cells expressing IgG versus IgA BCRs were found
- IgAVN steady-state B cell clones are maintained over time in the peripheral blood and have a homeostatic role. what is their specificity and how are they connected to the local mucosa?



Published: 31 July 2017

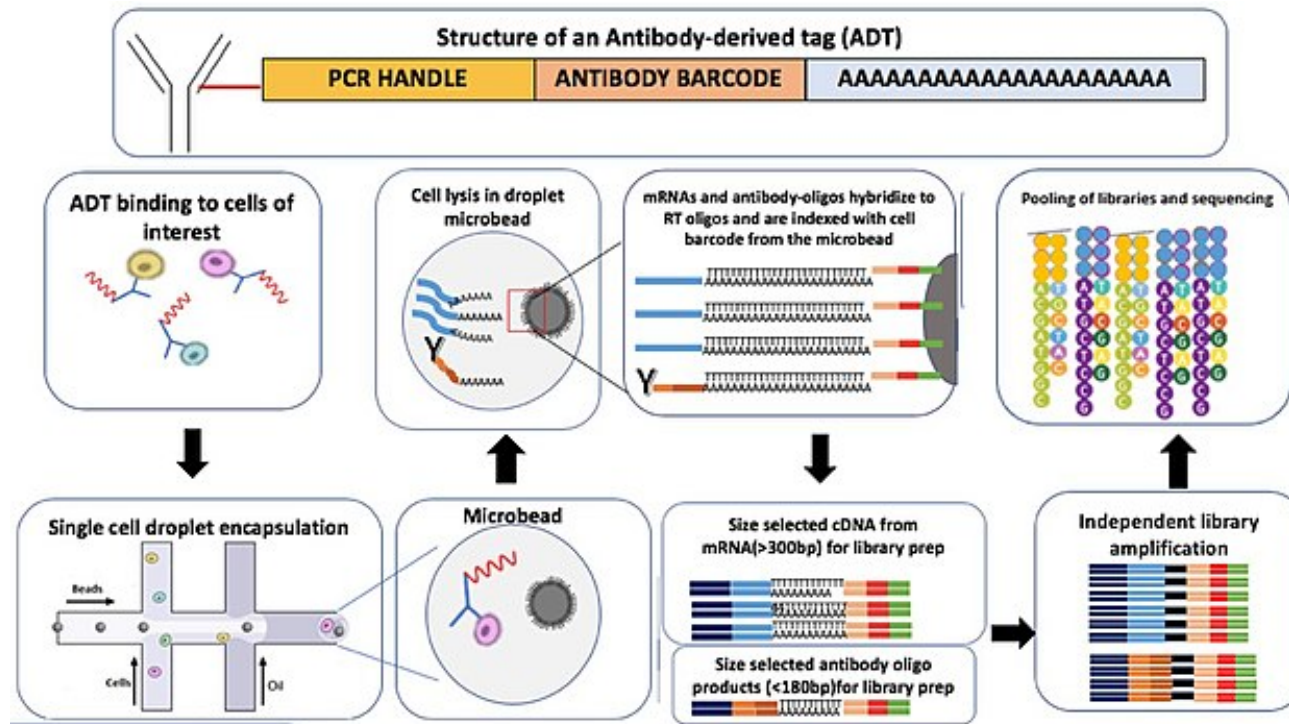
# Simultaneous epitope and transcriptome measurement in single cells

Marlon Stoeckius , Christoph Hafemeister, William Stephenson, Brian Houck-Loomis, Pratip K Chattopadhyay, Harold Swerdlow, Rahul Satija & Peter Smibert

*Nature Methods* **14**, 865–868(2017) | [Cite this article](#)

**32k** Accesses | **314** Citations | **199** Altmetric | [Metrics](#)

# Detecting transcriptomes and protein markers with CITE-Seq (Cellular Indexing of Transcriptomes and Epitopes by Sequencing)

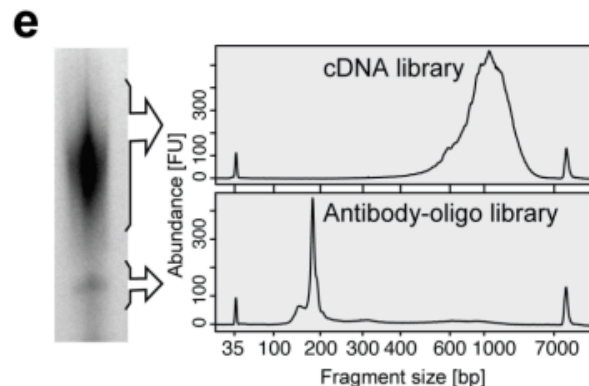
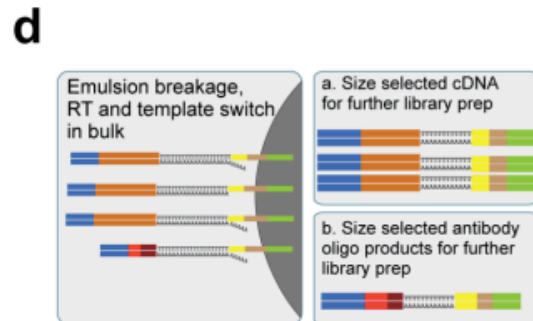
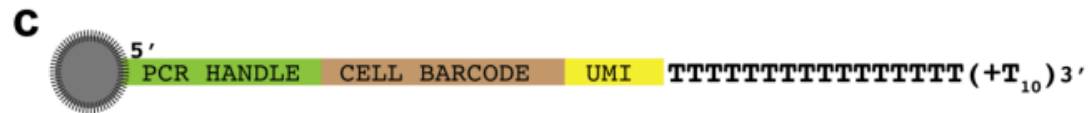


- CITE-Seq allows the simultaneous measurement of transcripts and proteins in single-cells so to get a sequenceable readout from an antibody
- Multiplexing protein marker detection with transcriptome profiling
- Cell phenotyping is made possible by conjugating DNA oligos to antibodies that contain a barcode for identification, can be captured by oligo-dT primers, and include a handle for PCR amplification

# CITE-Seq workflow

## Preparation of CITE-seq oligos & Antibody-Derived Tags (ADTs)

- biotinylation of oligos
- streptavidin labeling of antibodies
- conjugation of streptavidin-antibodies with biotinylated-oligos
- cells stained
- cDNA synthesized
- libraries are prepared

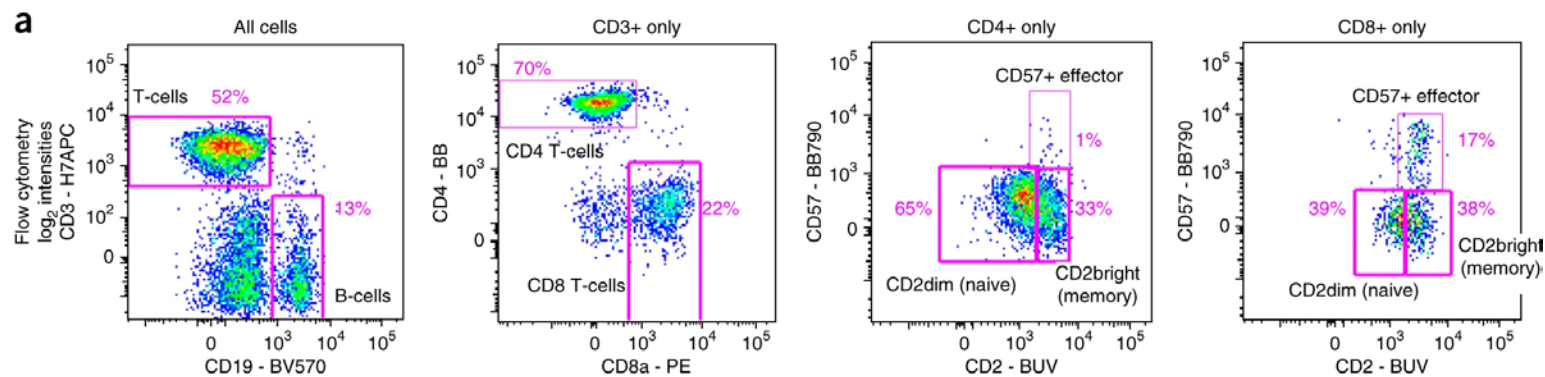


Antibody-oligonucleotide complexes appear as a high-molecular-weight smear when run on an agarose gel. Cleavage of the oligo from the antibody by reduction of the disulfide bond collapses the smear to oligo length.

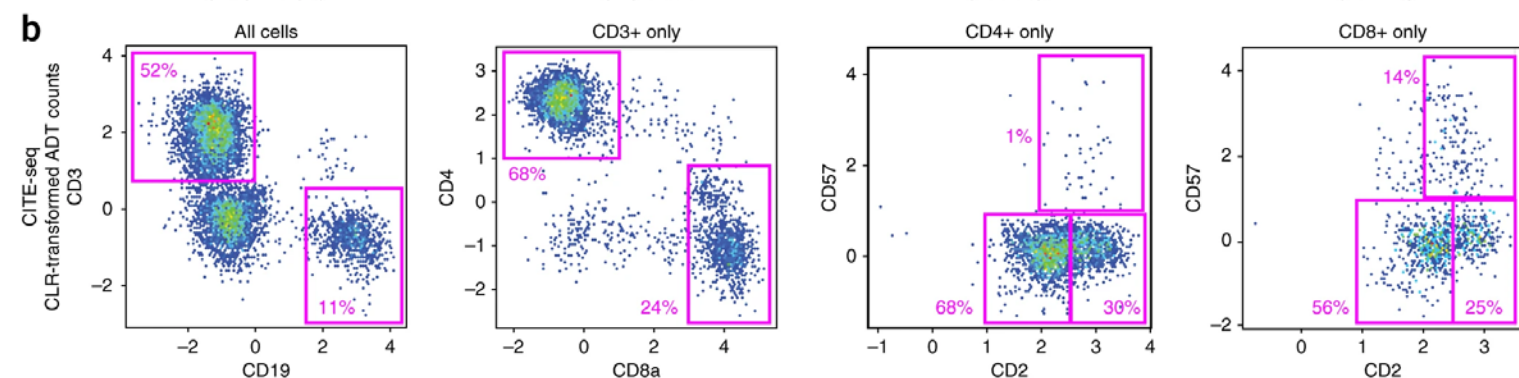
Drop-seq beads with conjugated oligonucleotides comprise of a common PCR handle, a cell barcode, followed by a unique molecular identifier (UMI) and a polyT-tail

RT and template switch is performed in bulk after emulsion breakage. After amplification, full length cDNA and antibody-oligo products are separated by size and amplified independently

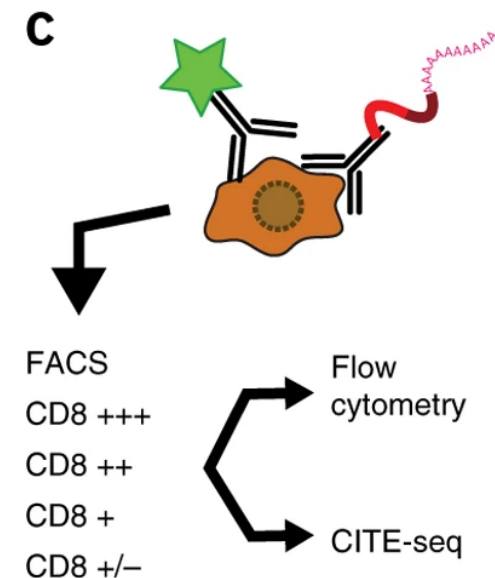
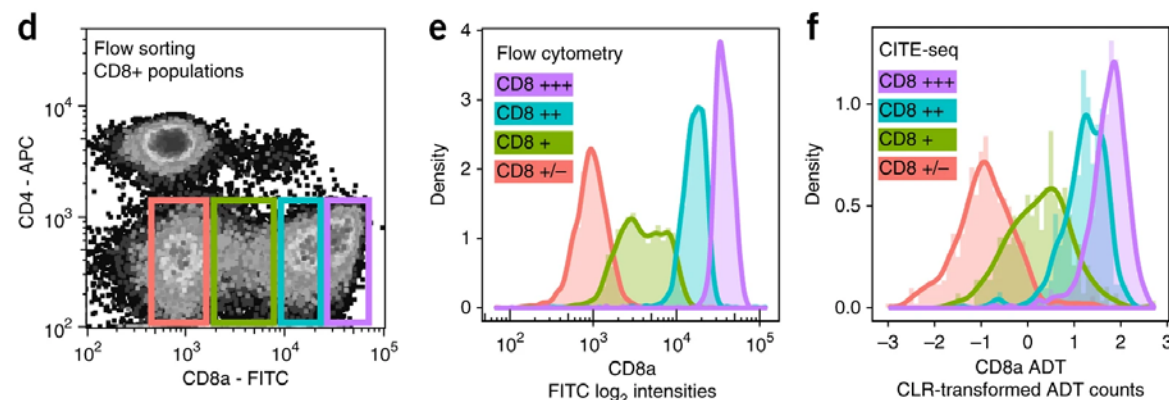
# CITE-seq is merging RNA-Seq and flow cytometry technologies



FACS

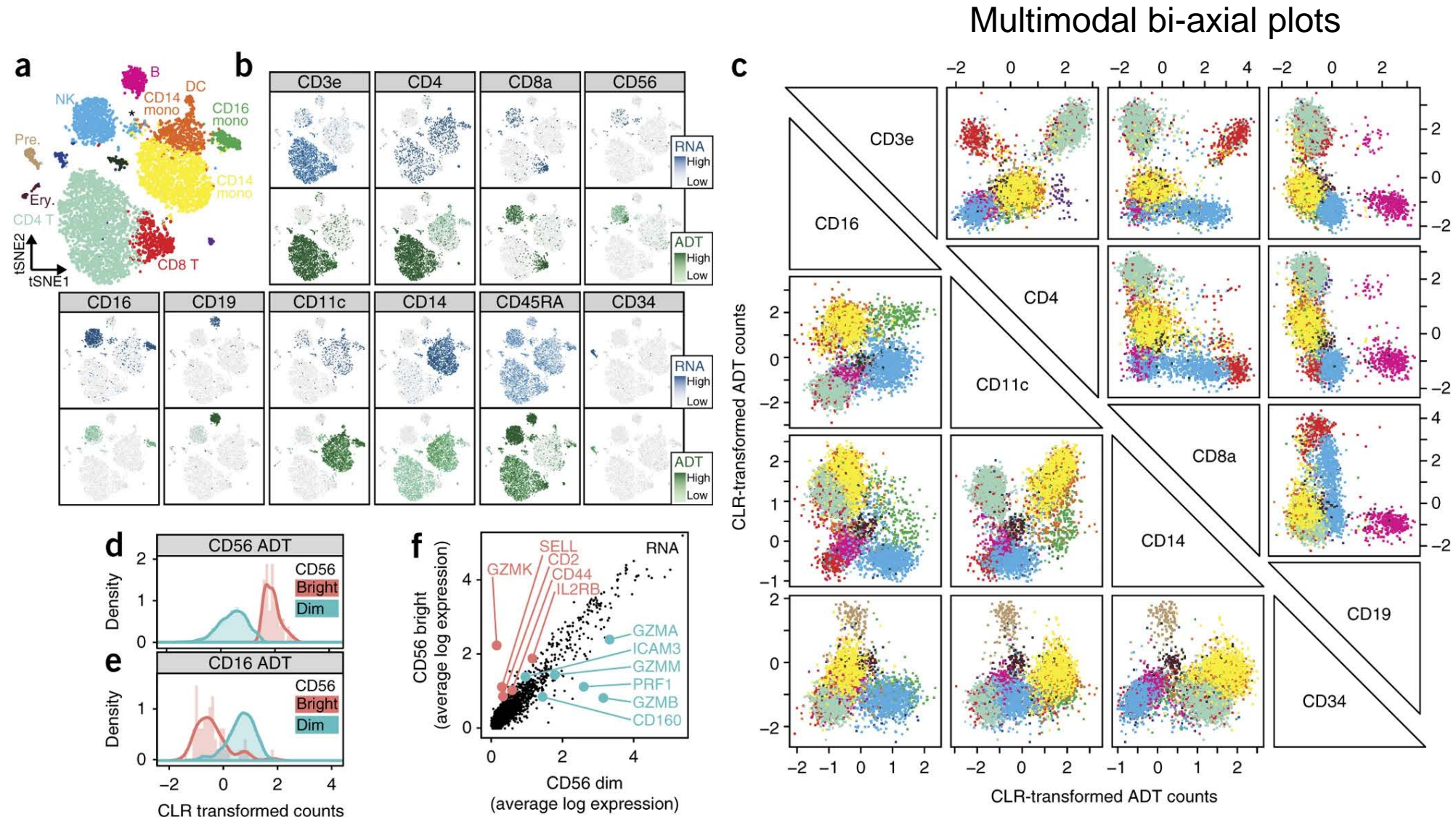


CITE-Seq





# CITE-seq allows for detailed multimodal characterization of cord blood mononuclear cells



# CITE-Seq method

## Conclusions

- CITE-seq enables simultaneous analysis of the transcriptome as well as the proteome of single cells
- It enables large-scale immunophenotyping with panels of tens to hundreds of antibodies, in contrast to flow and mass cytometry
- Can be adapted to detect small molecules, RNA interference, CRISPR, and other gene editing techniques
- Could be adapted for intracellular markers
- Can be modified so that only ADTs are analyzed on a massively parallel scale without capturing cellular mRNAs (cytometry by sequencing)



Thank you for your attention!