

# Mining the immune system for protective antibodies

Genomics England 4 May 2022

# OUR VISION: TO USE THE POWER OF THE HUMAN IMMUNE SYSTEM TO DISCOVER NEW MEDICINES AND DIAGNOSTICS



Discovering and developing protective, patient-originated therapeutic antibodies



Focus on protective antibody responses



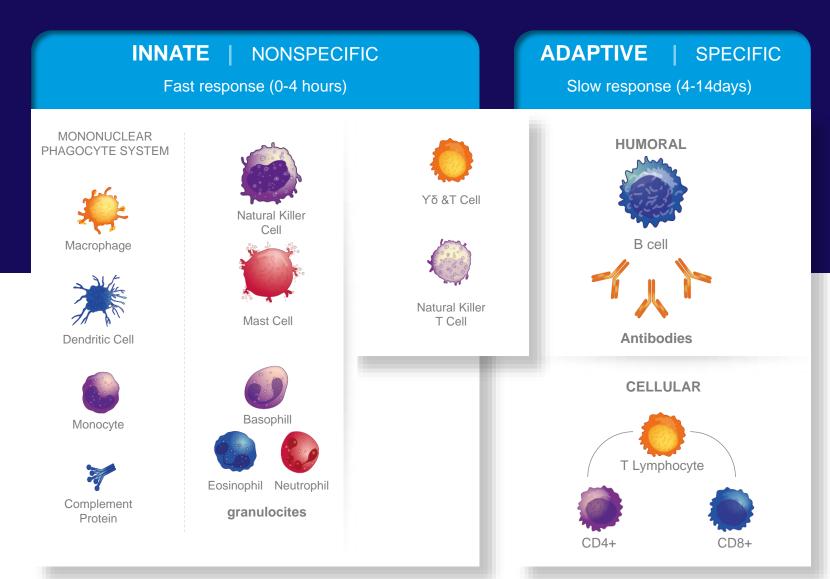




Advanced computational approaches

# B CELL RECEPTORS ARE A KEY COMPONENT OF ADAPTIVE IMMUNITY





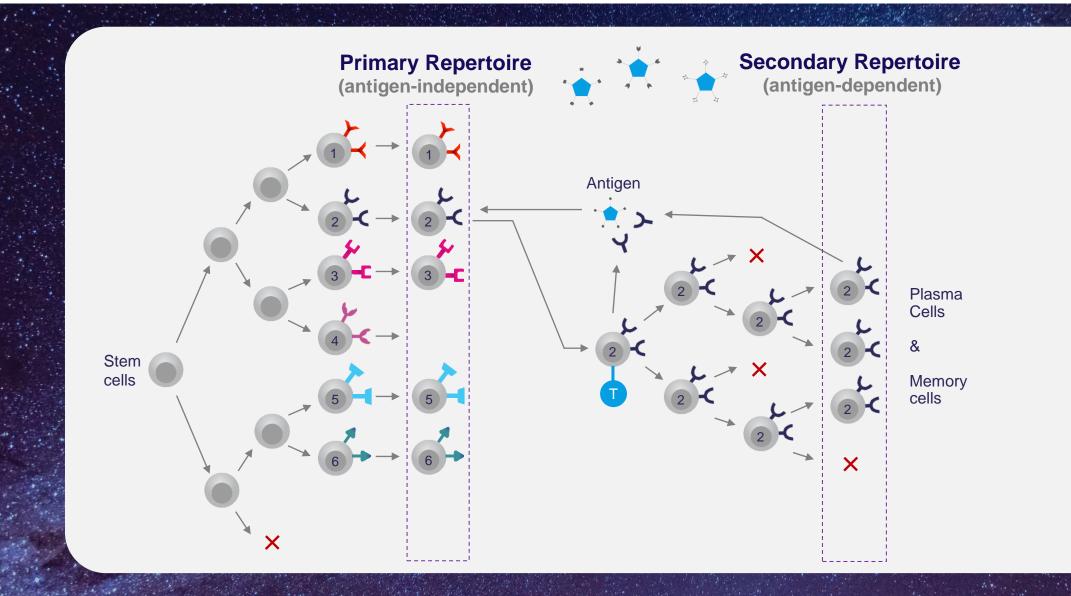
# THE B CELL RECEPTOR (ANTIBODY) REPERTOIRE



"The sum of all B cells expressing distinct B cell receptors, necessary to bind diverse antigens and produce an effective humoral immune response"

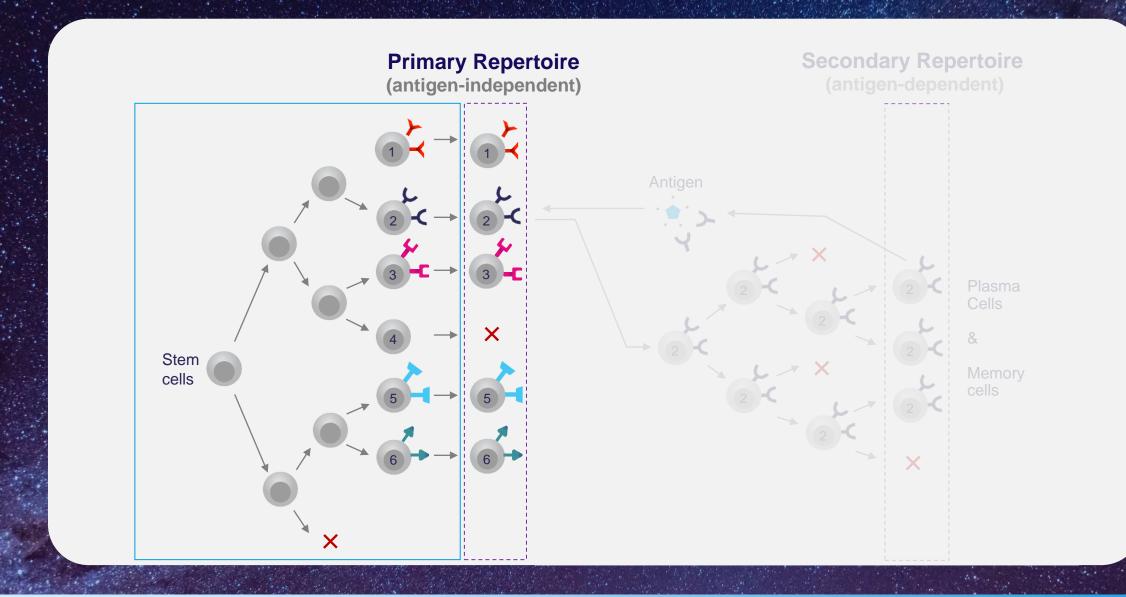
## THE B CELL RECEPTOR REPERTOIRE HAD TWO ELEMENTS





### FORMING THE PRIMARY REPERTOIRE



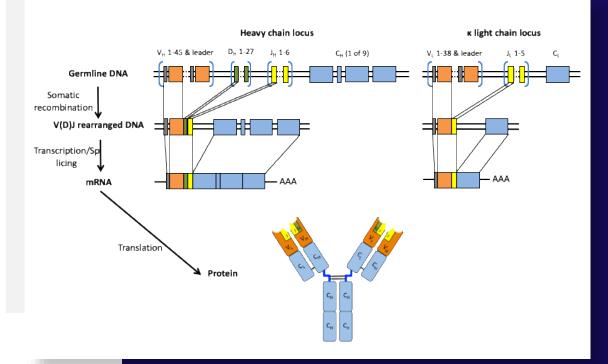


## **COMBINATORIAL DIVERSITY** - VDJ RECOMBINATION

Somatic recombination of gene segments during B cell development

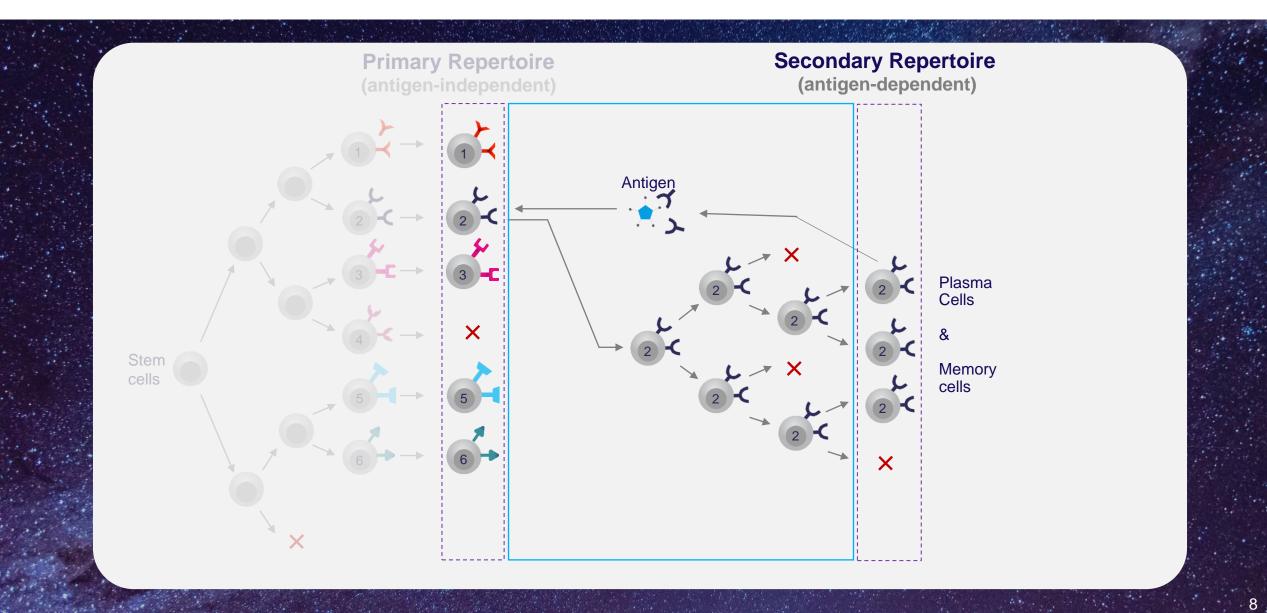
Flomont	Immunoglobulin		
Element	н	Κ+ λ	
	10	70	
Variable segments (V)	~40	~70	
Diversity segment (D)	23 0		
D segments read in three frames	rarely	-	
Joining segments (J)	6	5(κ) 4(λ)	
Joints with N- and P-nucleotides	2	50% of joints	
Number of V gene pairs	1.9 x 10 <sup>6</sup>		
Junctional diversity	~3 x 10 <sup>7</sup>		
otal diversity ~5 x 10 <sup>13</sup>			





## FORMING THE SECONDARY REPERTOIRE

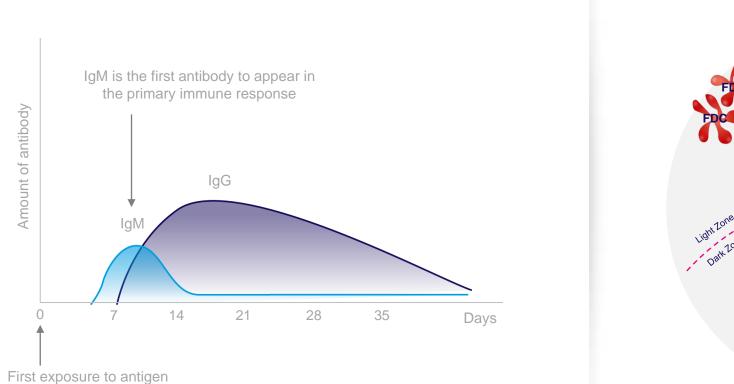


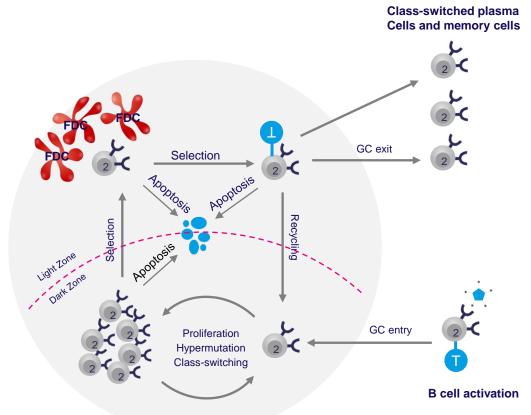


### **AFFINITY MATURATION IN THE GERMINAL CENTRE**



### **RAPID B CELL EVOLUTION OVER THE COURSE OF DAYS**





### **BCR HIGH THROUGHPUT SEQUENCING: HAS BEEN EVOLVING SINCE 2009**



### **High-Throughput Sequencing of the Zebrafish Antibody Repertoire**

Joshua A. Weinstein,<sup>1</sup>\* Ning Jiang,<sup>2</sup>\* Richard A. White III,<sup>3</sup> Daniel S. Fisher,<sup>1,4,5</sup> Stephen R. Quake<sup>1,2,3,4</sup>†

Despite tremendous progress in understanding the nature of the immune system, the full diversity of an organism's antibody repertoire is unknown. We used high-throughput sequencing of the variable domain of the antibody heavy chain from 14 zebrafish to analyze VD] usage and antibody sequence. Zebrafish were found to use between 50 and 86% of all possible VD1 combinations and shared a similar frequency distribution, with some correlation of VD] patterns between individuals. Zebrafish antibodies retained a few thousand unique heavy chains that also exhibited a shared frequency distribution. We found evidence of convergence, in which different individuals made the same antibody. This approach provides insight into the breadth of the expressed antibody repertoire and immunological diversity at the level of an individual organism.

he nature of the immune system's anti- new heavy-chain gene (Fig. 1). Antibodies are body repertoire has been a subject of formed by a mixture of recombination among fascination for more than a century. This repertoire is highly plastic and can be directed to create antibodies with broad chemical diversity and high selectivity (1, 2). There is also a good understanding of the potential diversity available and the mechanistic aspects of how this diversity is generated. Antibodies are composed of two types of chains (heavy and light), each containing a highly diversified antigen-binding domain (variable). The V, D, and J gene segments of the antibody heavy-chain variable genes go through a series of recombination events to generate a an individual at any point in time and how similar

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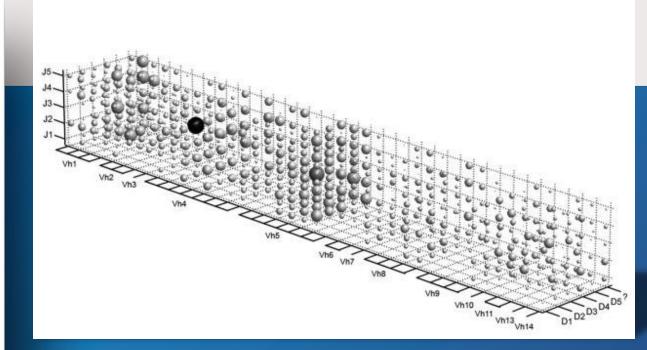
\*These authors contributed equally to this work †To whom correspondence may be addressed. E-mail: guake@stanford.edu

ognizable adaptive immune system whose features match the essential human elements (7, 8). Like humans, zebrafish have a recombination activating gene (RAG) and a combinatorial rearrangement of V, D, and J gene segments to create antibodies. They also have junctional diversity during recombination and somatic hypermutation of antibodies to improve specificity, and the organization of their immunoglobulin (Ig) gene loci approximates that of human (9). In addition, the zebrafish immune system has only ~300,000 antibody-producing B cells, making it three orders of magnitude simpler than mouse and five orders simpler than human in this

We developed an approach to characterize the antibody repertoire of zebrafish by analyzing complimentarity-determining region 3 (CDR3) of the heavy chain, which contains the vast majority of immunoglobulin diversity (10, 11) and can be captured in a single sequencing read (Fig. 1). Using the 454 GS FLX high-throughput pyrosequencing technology allowed sequencing of 640 million bases of zebrafish antibody cDNA from 14 zebrafish in four families (Fig. 1B). Zebrafish were raised in separate aquaria for each family and were allowed to have normal interactions with the environment, including the development of natural internal flora. We chose to investigate the quiescent state of the immune system, a state where the zebrafish had sampled a complex but fairly innocuous environment and had established an equilibrium of normal immune function, mRNA was prepared from whole fish, and we synthesized cDNA using primers designed to capture the entire variable region.

Between 28,000 and 112,000 useful sequencing reads were obtained per fish, and we focused our analysis on CDR3 sequences. Each read was assigned V and J by alignment to a reference with a 99.6% success rate (table S3); failures were due

to similarity in some of the V gene segments. D was determined for each read by applying a clustering algorithm to all of the reads within a given





# Enabled by 454 sequencing

www.sciencemag.org SCIENCE VOL 324 8 MAY 2009

gene segments, sequence diversification at the

junctions of these segments, and point mutations

throughout the gene (3). Estimates of immune

diversity for antibodies or the related T cell re-

ceptors either have attempted to extrapolate from

small samples to entire systems or have been

limited by coarse resolution of immune receptor

genes (4). However, certain very elementary ques-

tions have remained open more than a half-century

after being posed (1, 5, 6): It is still unclear what

fraction of the potential repertoire is expressed in

repertoires are between individuals who have lived

in similar environments. Moreover, because each

individual's immune system is an independent ex-

periment in evolution by natural selection, these

questions about repertoire similarity also inform

our understanding of evolutionary diversity and

Zebrafish are an ideal model system for

studying the adaptive immune system because

in evolutionary terms they have the earliest rec-

convergence

8

### **HOW RARE IS CONVERGENCE?**

### DIVERSITY OF THE HUMAN REPERTOIRE IS THEORETICALLY 1 X 10<sup>13</sup>

- Number of peripheral B cells in a healthy individual is approx. 1x10<sup>9</sup>
- Circulating B Cell Repertoire is therefore a fraction of the total diversity
- The amount of information encoded in "genome" of the adaptive immune system exceeds the human genome by 4 orders of magnitude



10 INDIVIDUALS VH SEQUENCED 3 BILLION HEAVY CHAINS

Briney et al Nature 2019

- Largely unique repertoires for each individual
- Between 2 individuals 0.95% of the repertoire was shared. Shared clonotypes were skewed towards short CDR3s
- Only 0.022% of clones were shared between all 10 individuals
- Commonality is driven by early BCR development rather than common antigen-specific selection, although there is some convergence due to vaccination and common infections

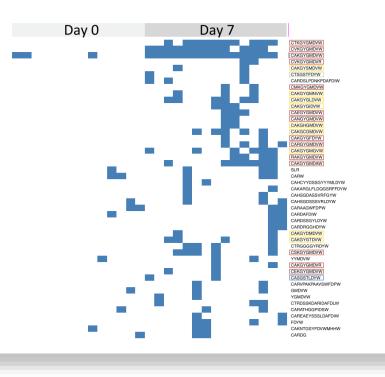
# CONVERGENCE INCREASES AFTER COMMON ANTIGEN EXPOSURE

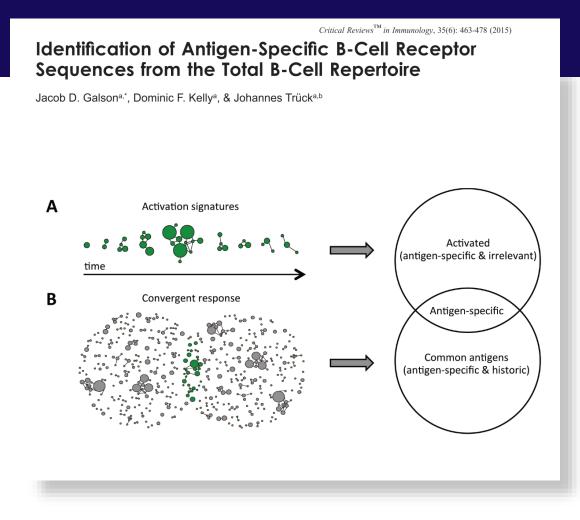


- Convergence increases after a **common** antigen stimulus and can be used to identify rare antigen-specific sequences
- Vaccination used as an example of a strong, specific stimulus

### Identification of Antigen-Specific B Cell Receptor Sequences Using Public Repertoire Analysis

Johannes Trück,<sup>\*,1</sup> Maheshi N. Ramasamy,<sup>\*,1</sup> Jacob D. Galson,\* Richard Rance,<sup>†</sup> Julian Parkhill,<sup>†</sup> Gerton Lunter,<sup>‡</sup> Andrew J. Pollard,\* and Dominic F. Kelly\*





### AUTOANTIBODIES ARE GENERALLY VIEWED AS 'BAD GUYS"

### MANY AUTOIMMUNE DISEASES ARE THE RESULT OF PATHOGENIC AUTOANTIBODIES:

- SLE (Polyclonal autoreactive B cells)
- Myasthenia Gravis (anti-AchR)
- Neurological disease (anti-NMDA Receptor encephalitis
- Pemphigus (anti- desmosomal proteins)

# ALCHEMAB

### TREATMENTS:

- Ablate B cells (anti-CD20)
- Plasmapheresis
- Anti-FcRn
- High dose IVIG to block
- Anti-IDs (e.g. anti-anti-Dsg3 autoantibodies)

# IF THERE ARE BAD GUYS THERE ARE ALWAYS GOOD GUYS



### Published: 19 March 2013

# Protective autoantibodies in the rheumatic diseases: lessons for therapy

Gregg J. Silverman ⊠, Jaya Vas & Caroline Grönwall

Nature Reviews Rheumatology9, 291–300 (2013)Cite this article1639Accesses32Citations1AltmetricMetrics

# ALDH4A1 is an atherosclerosis auto-antigen targeted by protective antibodies

https://doi.org/101038/s41586-020-2993-2

Received: 3 December 2019

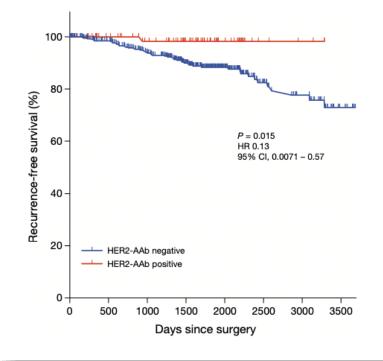
Accepted: 5 October 2020

Published online: 2 December 2020

Cristina Lorenzo<sup>1</sup>, Pilar Delgado<sup>14</sup>, Christian E. Busse<sup>2,7</sup>, Alejandro Sanz-Bravo<sup>1,7</sup>, Inmaculada Martos-Folgado<sup>1,7</sup>, Elena Bonzon-Kulichenko<sup>3,4,7</sup>, Alessia Ferrarini<sup>3</sup>, Ileana B. Gonzalez-Valdes<sup>3</sup>, Sonia M. Mur<sup>1</sup>, Raquel Roldán-Montero<sup>6</sup>, Diego Martinez-Lopez<sup>5</sup>, Jose L. Martin-Ventura<sup>4,5</sup>, Jesús Vázquez<sup>3,4</sup>, Hedda Wardemann<sup>2</sup> & Almudena R. Ramiro<sup>150</sup> Breast Cancer Res Treat (2016) 157:55-63 DOI 10.1007/s10549-016-3801-4

### Protective effect of naturally occurring anti-HER2 autoantibodies on breast cancer

Yukiko Tabuchi<sup>1</sup> · Masafumi Shimoda<sup>1</sup> · Naofumi Kagara<sup>1</sup> · Yasuto Naoi<sup>1</sup> · Tomonori Tanei<sup>1</sup> · Atsushi Shimomura<sup>1</sup> · Kenzo Shimazu<sup>1</sup> · Seung Jin Kim<sup>1</sup> · Shinzaburo Noguchi<sup>1</sup>



### **ALCHEMAB CONCEPT**

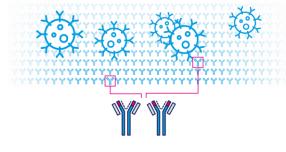


WE IDENTIFY

We identify especially resilient individuals – and learn how they overcome or resist disease We sequence B cells from the resilient individuals and identify antibodies with similar properties

**WE SEQUENCE** 

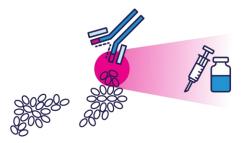




Antibodies

WE DISCOVER

We discover the binding targets of the antibodies, understand their protective properties and develop candidates that replicate the protective effect



Novel Antibody Therapeutic

Unbiased platform to identify novel therapeutics

### **DEFINING "RESILIENCE"**

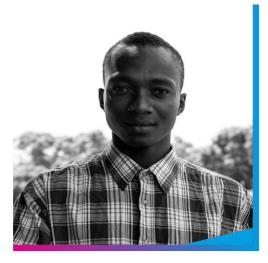




Patients who survive advanced cancer



Patients progressing unusually slowly with neuro-degenerative disorders



People who survive grievous, deadly infectious disease



Long-lived, healthy individuals

# WE COLLABORATE WITH A BROAD AND GROWING NETWORK OF INSTITUTIONS

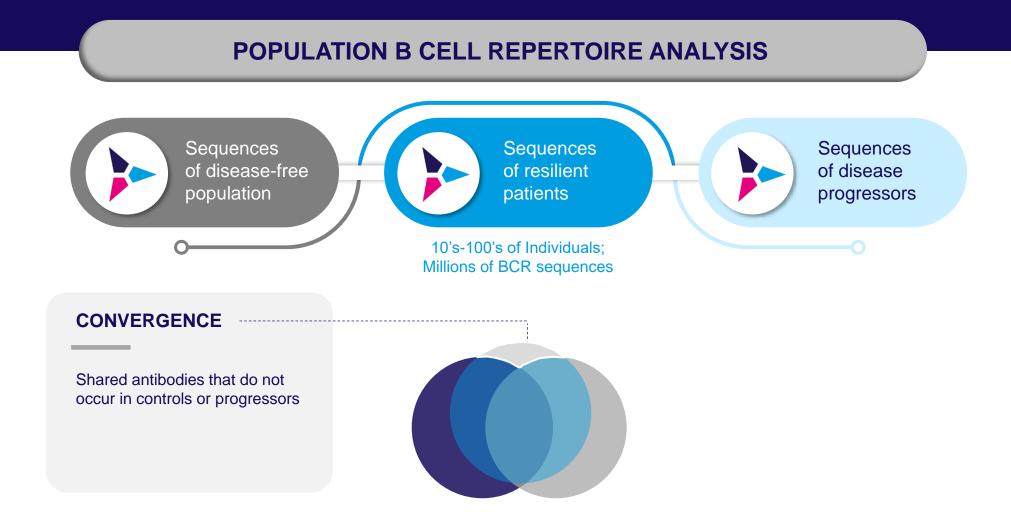




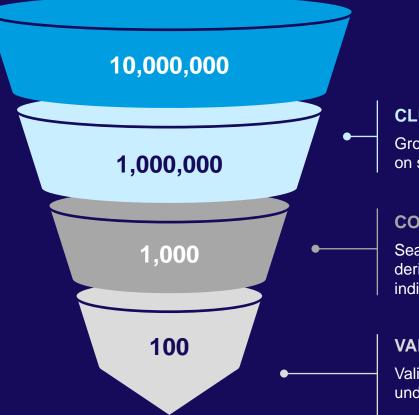


## CONVERGENT AUTOANTIBODY SEQUENCES PROVIDE THE STARTING POINT FOR DISCOVERY





## **REDUCING THE VAST B CELL REPERTOIRE DOWN TO CANDIDATE ANTIBODIES**



### **CLUSTERING**

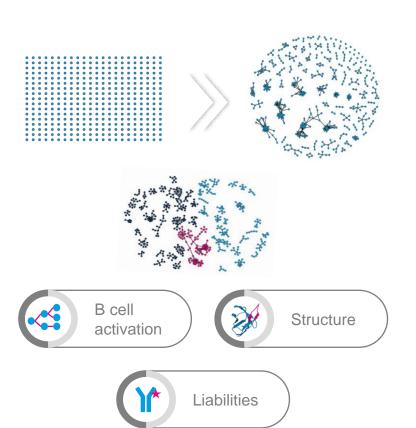
Grouping together antibodies based on sequence relatedness

### CONVERGENCE

Searching for clusters containing sequences derived from multiple resilient individuals – indicates selection for similar specificities

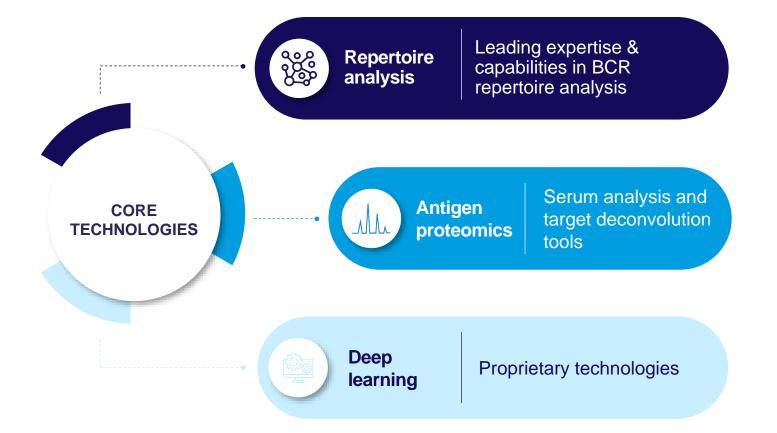
### VALIDATE & TRIAGE

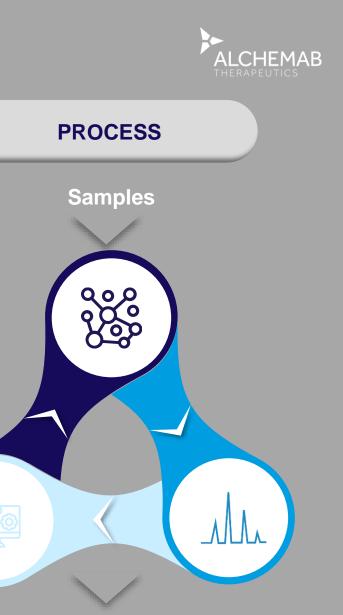
Validating convergent signals, and understanding features of the best antibodies





### DISCOVERY PROCESS POWERED BY ADVANCED SEQUENCING, BIG DATA, AND DEEP LEARNING

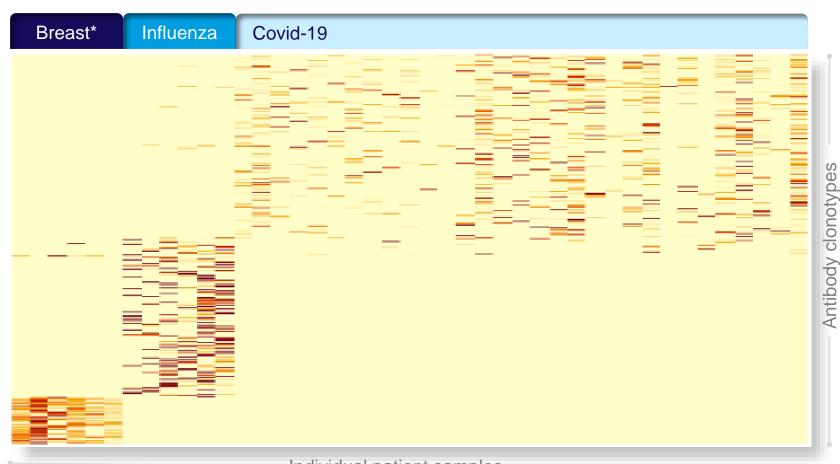




Data driven phenotypic and functional biology cascade

# DISEASE-ASSOCIATED ANTIBODY SIGNATURES

Shared by individuals within a disease group and distinct from healthy controls



Individual patient samples

Heatmap of 1,337 COVID-19 clonotypes, 1,180 Influenza clonotypes and 351 breast cancer clonotypes, demonstrating that the convergent signatures are unique to each disease cohort. Healthy controls subtracted.

\*Breast cancer



# Infectious Disease CASE STUDY

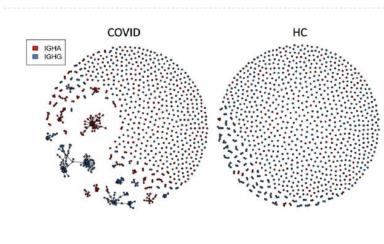
### **COVID-19 STUDY**



### frontiers in Immunology

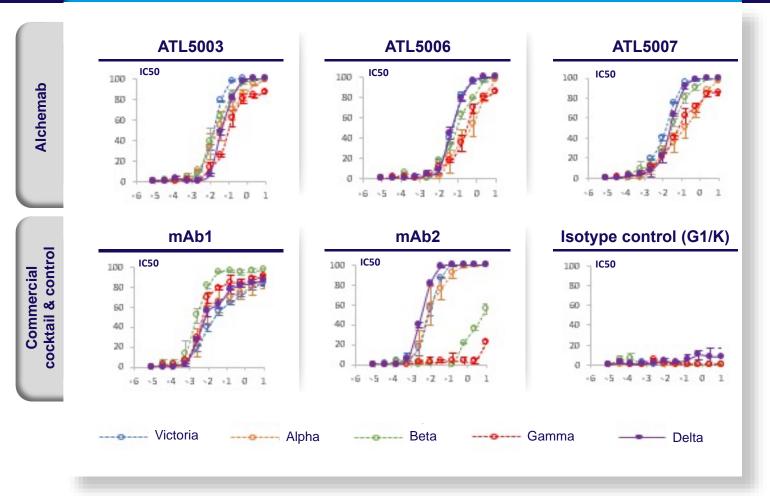
### Deep Sequencing of B Cell Receptor Repertoires From COVID-19 Patients Reveals Strong Convergent Immune Signatures

Jacob D. Galson<sup>1\*</sup>, Sebastian Schaetzle<sup>1</sup>, Rachael J. M. Bashford-Rogers<sup>1,2</sup>, Matthew I. J. Raybould<sup>3</sup>, Aleksandr Kovaltsuk<sup>3</sup>, Gavin J. Kilpatrick<sup>1</sup>, Ralph Minter<sup>1</sup>, Donna K. Finch<sup>1</sup>, Jorge Dias<sup>1</sup>, Louisa K. James<sup>4</sup>, Gavin Thomas<sup>4</sup>, Wing-Yiu Jason Lee<sup>4</sup>, Jason Betley<sup>5</sup>, Olivia Cavlan<sup>1</sup>, Alex Leech<sup>1</sup>, Charlotte M. Deane<sup>3</sup>, Joan Seoane<sup>6</sup>, Carlos Caldas<sup>7</sup>, Daniel J. Pennington<sup>4</sup>, Paul Pfeffer<sup>4</sup> and Jane Osbourn<sup>1</sup>



Galson et al., https://doi.org/10.3389/fimmu.2020.605170

### Potent multi-strain covid neutralizing antibodies identified

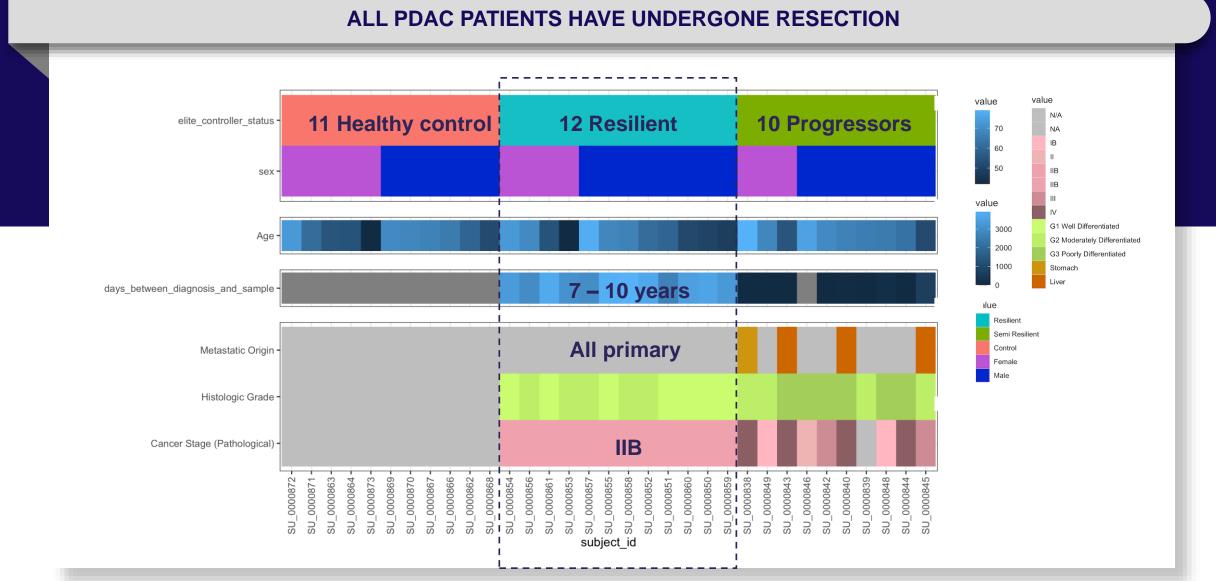




# Oncology CASE STUDY

### PANCREATIC CANCER COHORT





### HIGHLY CONVERGENT RESILIENT CLONOTYPES FOUND IN MULTIPLE INDIVIDUALS



10 clonotypes found with exceptional convergence among resilient individuals which were not found in progressors:

• Length-independent super-convergence

Low probability of generation & rare in healthy controls

Predominantly IgG1

CLUSTER SIZE	CONVERGENCE LEVEL (OUT OF 12)	CDR3 LENGTH	MUTATIONS	GENERATION PROBABILITY	PROP. IN HEALTHY CONTROL	PREVALENT ISOTYPE
151	8	20	1.58	4.35E-12	0.060	IGHG1
40	8	20*	1.65	9.34E-12	0.050	IGHG1
43	8	19*	1.35	4.63E-20	0.186	IGHG1
73	7	16	1.51	2.13E-13	0.055	IGHG1
42	5	16	2.07	1.29E-12	0	IGHG1
73	5	15*	1.41	7.42E-11	0.082	IGHG1
33	5	14*	1.52	7.69E-11	0	IGHG1
17	5	13	1.18	1.14E-11	0.059	IGHG1
16	6	13	17.63	1.01E-11	0	IGHM
22	5	11	25.59	5.20E-10	0.091	IGHA1

### HOMOLOGY TO APPROVED KDR MAB TRANSLATES TO TARGET BINDING



Ramucirumab is a VEGFR2 (KDR) antibody, approved for treatment of solid tumors

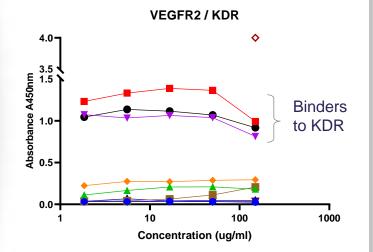
### ARTICLES | VOLUME 383, ISSUE 9911, P31-39, JANUARY 04, 2014

Ramucirumab monotherapy for previously treated advanced gastric or gastro-oesophageal junction adenocarcinoma (REGARD): an international, randomised, multicentre, placebo-controlled, phase 3 trial

Published: October 03, 2013 DOI: https://doi.org/10.1016/S0140-6736(13)61719-5 🛛 🖲 Check for updates

One of Alchemab's convergent clusters is highly homologous to ramucirumab

 Assay shows binding for multiple antibodies from clonotype 41671 to KDR





# Neuro degeneration CASE STUDY

## **DEFINING RESILIENCE IN AD**



MEASURE OF RESILIENCE	RESILIENT SAMPLE COHORTS	Report of Extraordinary individual with Presenilin (PSEN1) mutation but considerable delay of cognitive decline, with high b-amyloid plaque load but low Tau <i>Arboleda-Valasquez et al (2019) Nature Medicine</i>
Mini Mental State exam Cognitive function	Commercial study <b>100+ cohort</b> EPAD*	PSEN1 mutation carrier with two APOE3 PSEN1 mutation carrier with MCI onset at typical age
ApoE status and other genetic mutations	EPAD 100+ cohort	Amyloid plaque burden (PIB DVR)
B-amyloid (CSF/ plaques) Tau (CSF/plaques) Additional biomarkers (NfL)	EPAD	PHF tau burden (FTP SUVR) 0.8 1.4 2

\* European Prevention of Alzheimer's Dementia

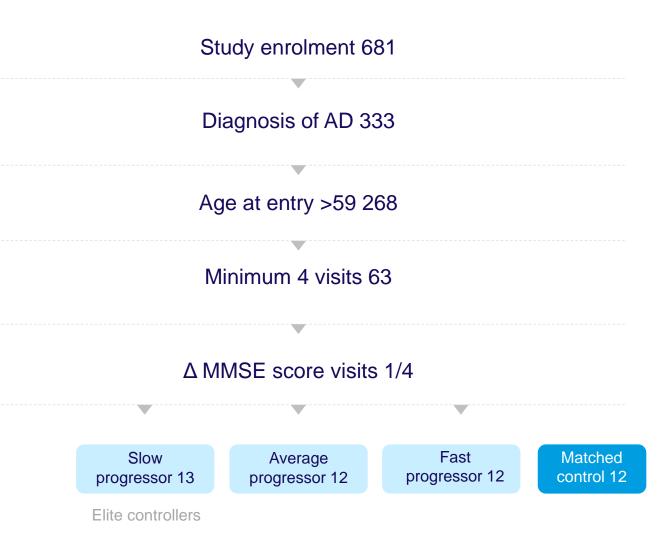
## ALZHEIMER'S DISEASE PILOT STUDY

Longitudinal study over 2 years (visits every 6 months)

Mini Mental State Exam score used for assessment of disease progression

Starting range 15-24 out of a maximum score of 30





# IDENTIFICATION OF AD CONVERGENT CLONES



Sequence data from 30 Alzheimer's patients was triaged to select 38 antibodies according to the following workflow:

### CLONOTYPING:

sequences with near identical V, J, and CDR3 length are clustered

### • EXCLUSIVITY:

Clonotypes chosen which are sare exclusive to resilient group and not seen in healthy controls

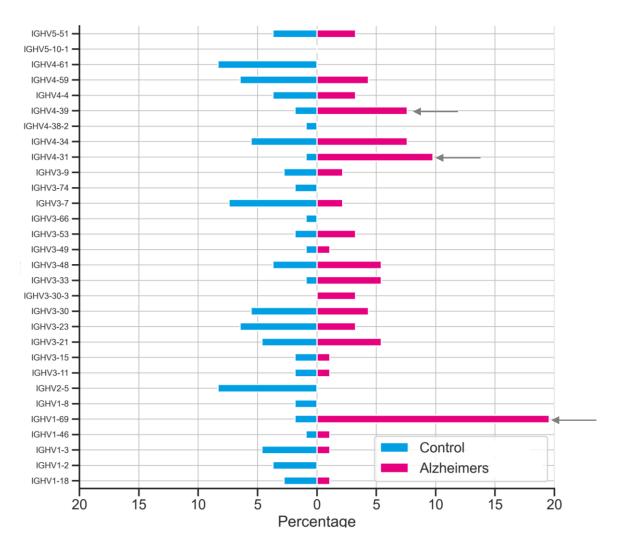
### • EXPRESSION FILTER:

Sequence seen more than once per sample

### • MUTATION FILTER:

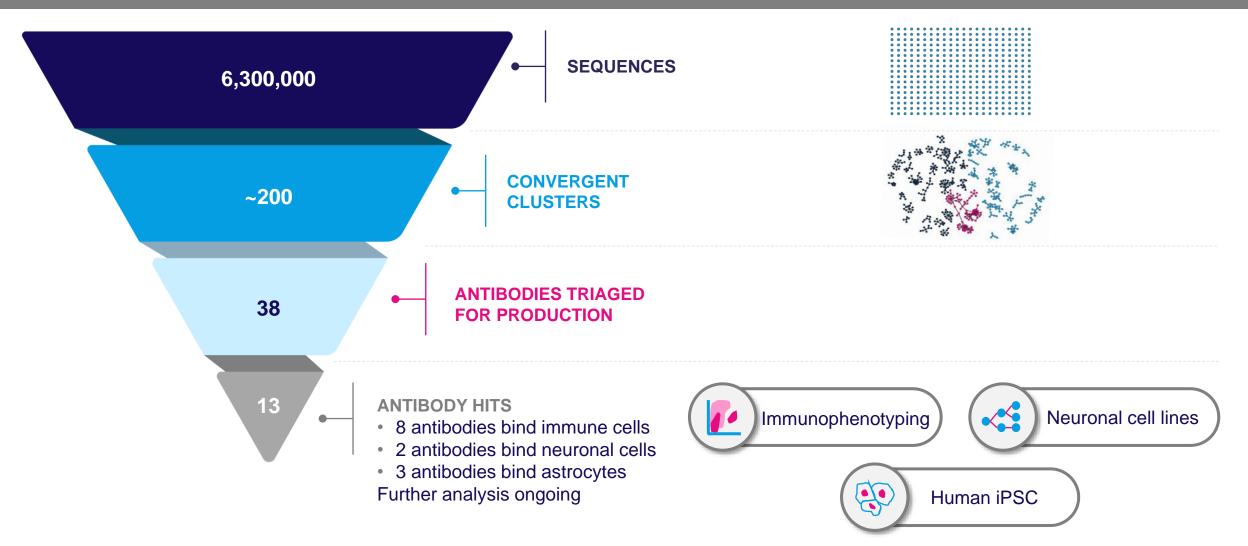
Filter for clonotypes undergoing active selection via somatic hypermutation

# Exclusively convergent clonotypes have a highly skewed VH germline gene distribution which indicates disease specific activation



## ALZHEIMER'S DISEASE ANTIBODY SELECTION

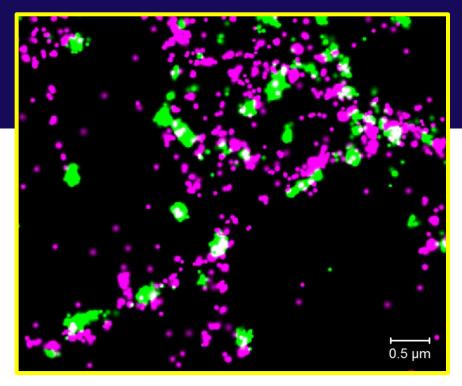


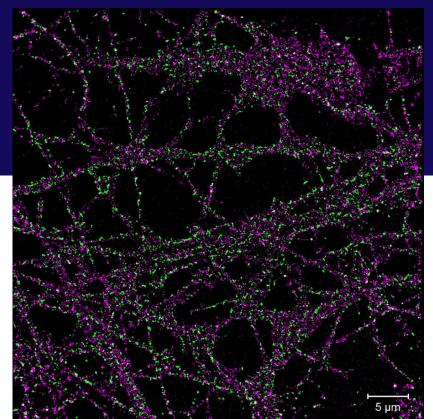


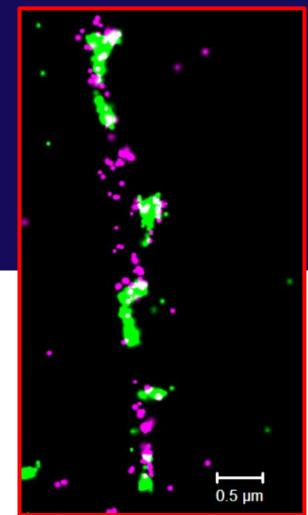
# AD CONVERGENT ANTIBODY SHOWING NEURONAL BINDING (TARGET UNKNOWN)



### Alchemab Ab ATL 4527 VGLUT1 (pre-synaptic)









# SUMMARY

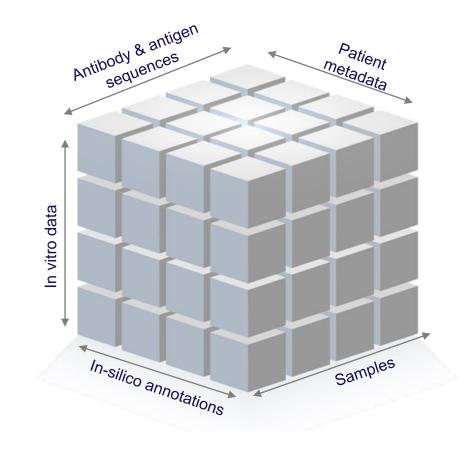
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ALCHEMAB DATA CUBE: EXCEPTIONAL INSIGHT INTO BCR REPERTOIRES AND THEIR ASSOCIATION WITH DISEASE

### • FULL STACK AND ADVANCED ANALYTICS PIPELINE

### • DEEP LEARNING TOOLKIT:

- Quality assessments
- Clustering
- Cross disease analysis
- In silico light chain pairing
- Patient stratification

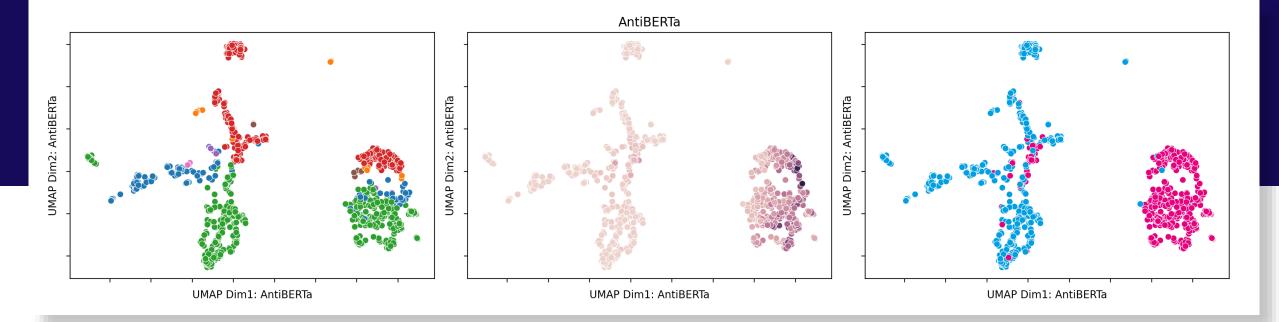


...enabling a powerful next generation drug discovery engine



# **ANTIBERTA: ALCHEMABS'S ANTIBODY-SPECIFIC LANGUAGE MODEL**





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32

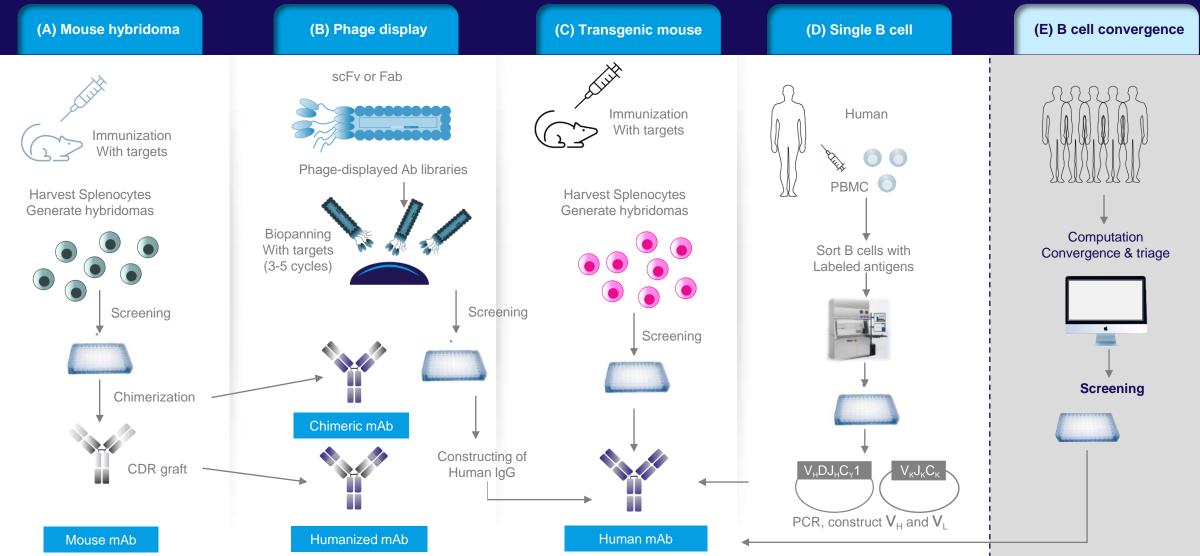
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V Gene Family Number of Mutations IGHV1 IGHV5 0 IGHV2 IGHV6 8 IGHV3 IGHV7 16 IGHV4

Naive vs. Memory B Cell Naive Memory

# CONVERGENCE ANALYSIS COULD BE PART OF THE NEXT WAVE OF ANTIBODY GENERATION





Source: Journal of Biomedical Science, 21:1 (2020) - Adapted

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Advanced computational approaches