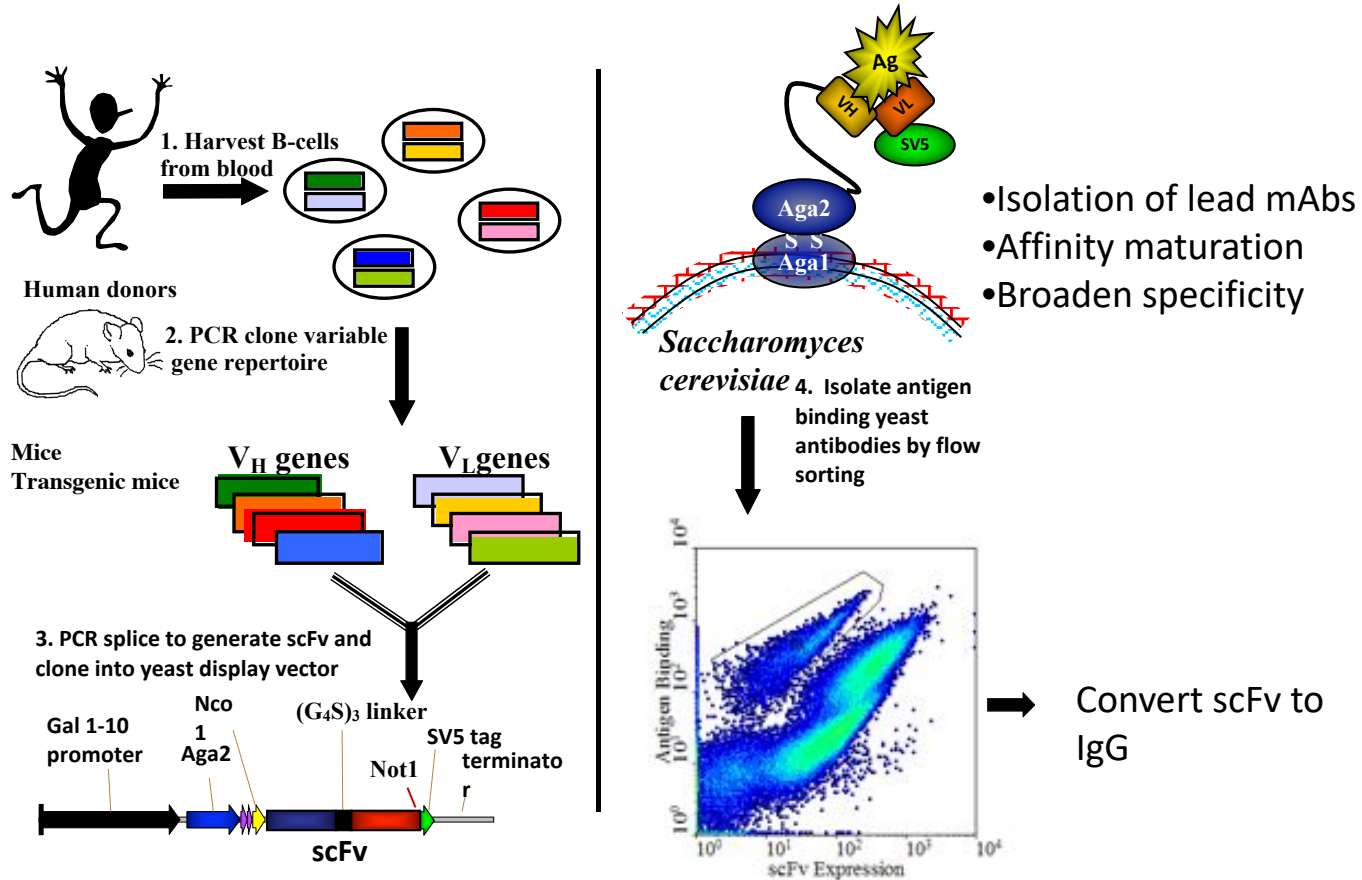
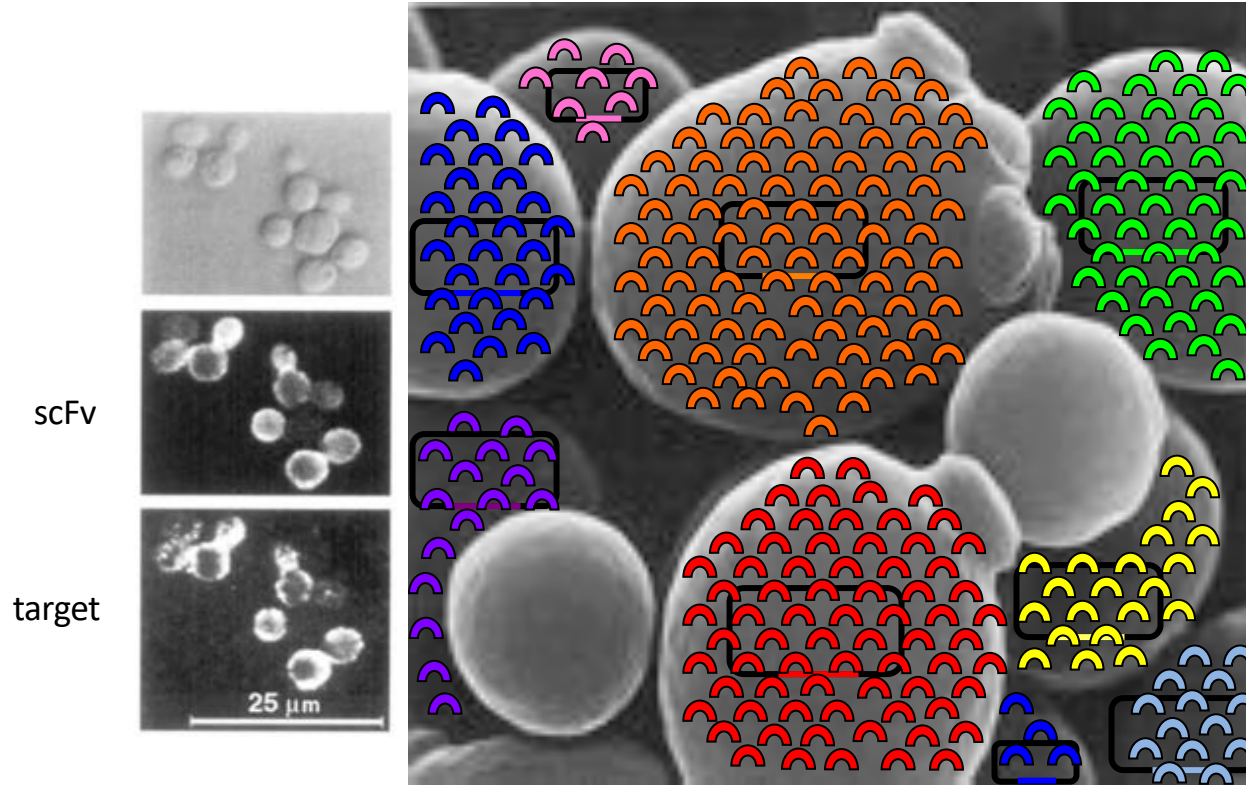


# Yeast display and immune libraries

# Overview of Yeast display of antibodies



Yeast display: each yeast displays hundreds of thousands of copies of a single antibody



# Phage vs. Yeast Display

## Phage

- Larger primary libraries
- Selection from naïve libraries
- Relatively straightforward
- Soluble scFv or Fab easily made in *E. coli*
- General familiarity with *E. coli*
  
- Selection is a “black box”
- Antibody must be expressed and purified to measure affinity
- Repertoires incompletely sampled

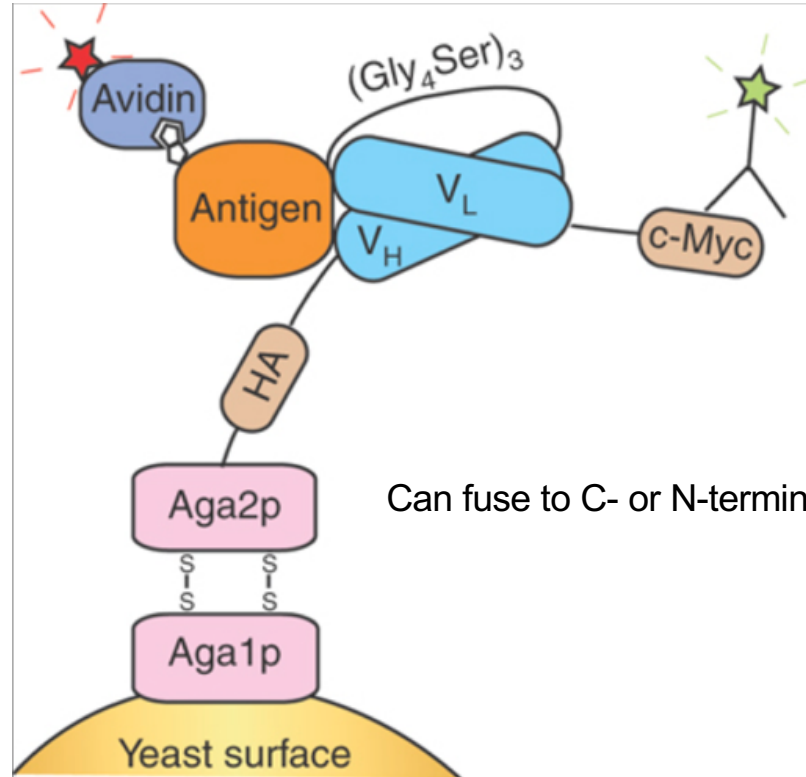
## Yeast

- Smaller primary libraries
  - Libraries  $\leq 10^8$  with gap repair
  - Immune libraries and affinity maturation
- Naive library selections more challenging
- Requires flow cytometry
- Less general familiarity with yeast
- Need to subclone to make native Ab fragment
  
- Precise selection calibration
- Direct characterization on yeast without antibody purification:
  - Affinity; epitopes
- Repertoires sampled more completely as greater proportion of antibodies displayed\*

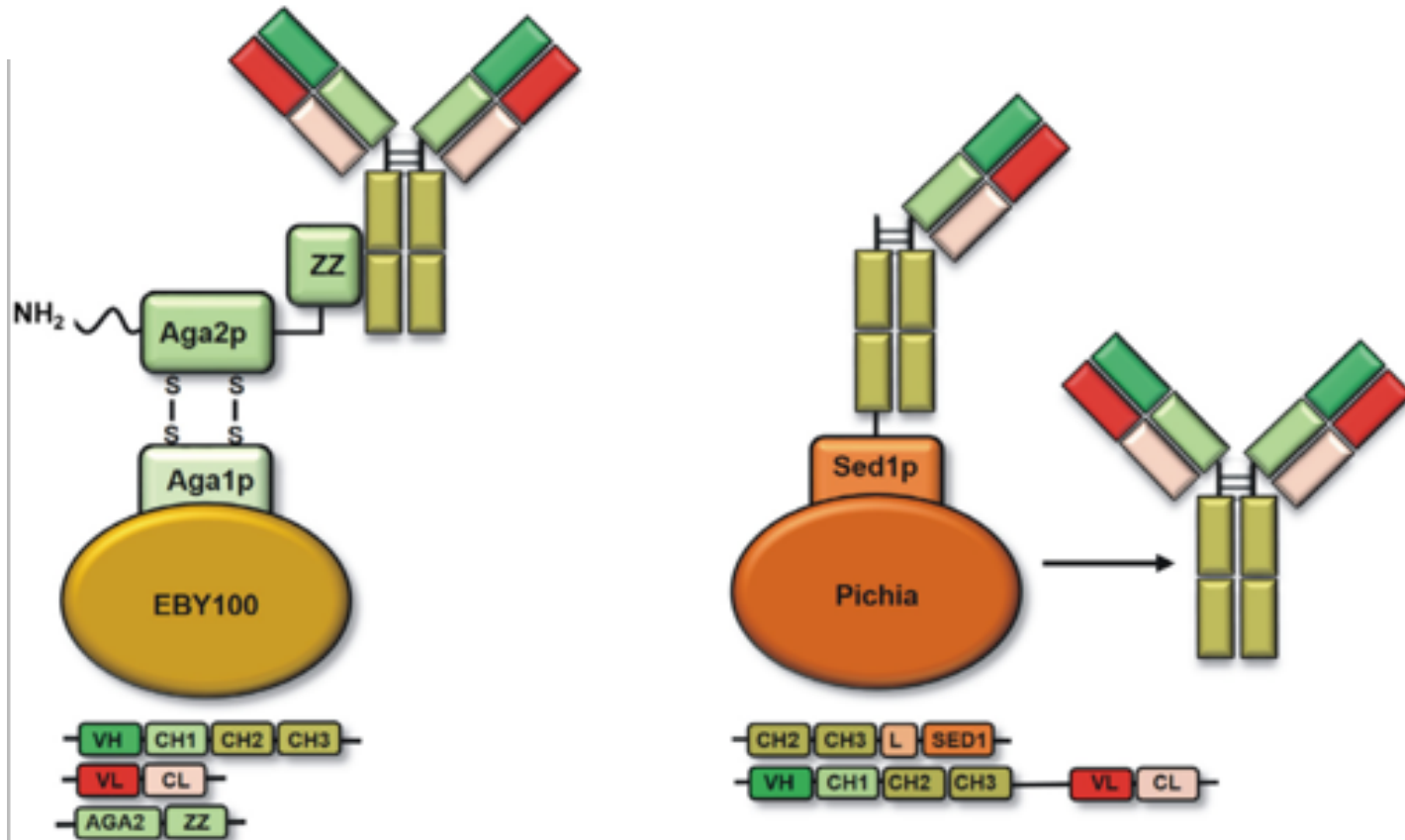
\*Bowley et al. (2007) PEDS, **20** 81-90



# Aga2 for antibody display

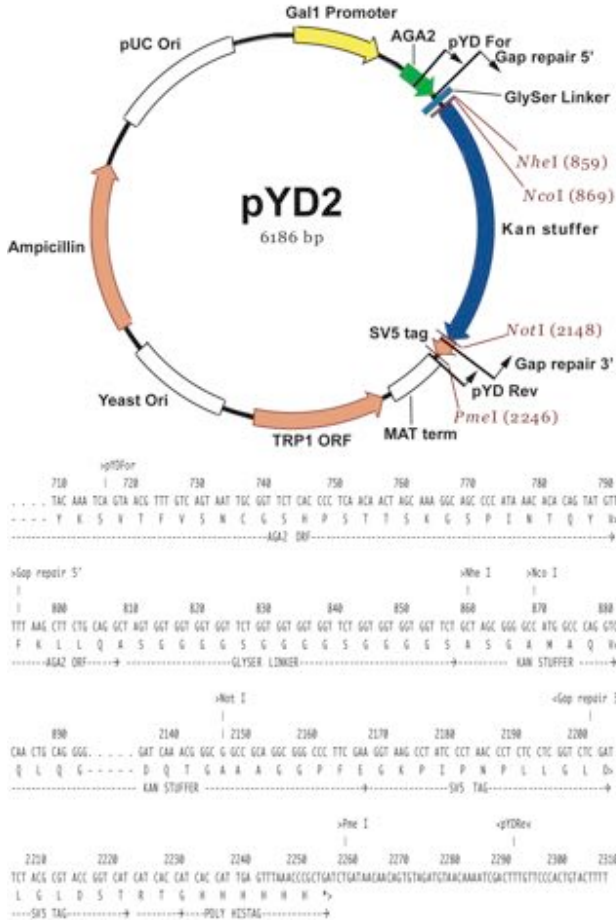


# Additional yeast display formats



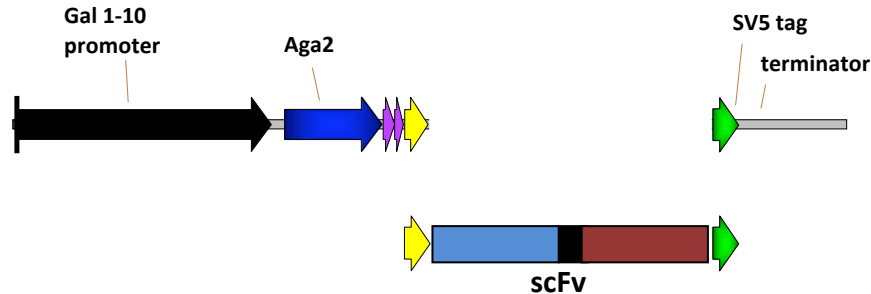
# Cloning yeast display libraries

## Yeast display vector systems: scFv



# Yeast antibody library construction by gap repair

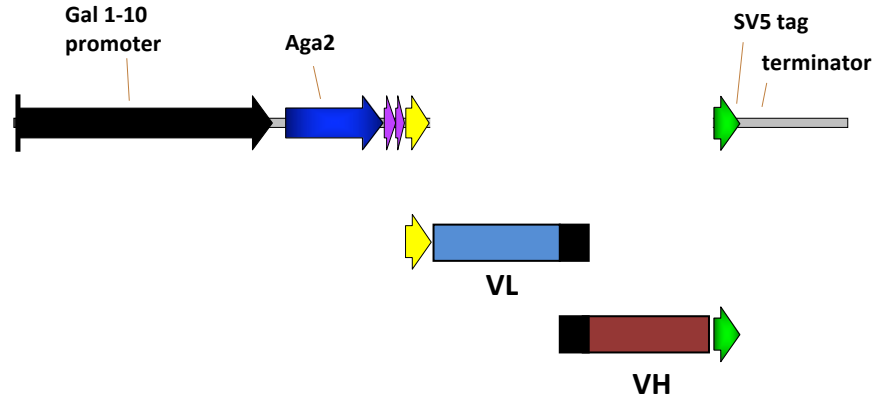
Clone scFv directly into yeast using gap repair:



- Create scFv by cloning or assembly
- Double cut vector
- Generate PCR fragment with > 25 bp overhang
- Mix vector & insert and transform
- Efficiency  $\sim 10^6$ /ug insert

# Yeast antibody library construction by gap repair

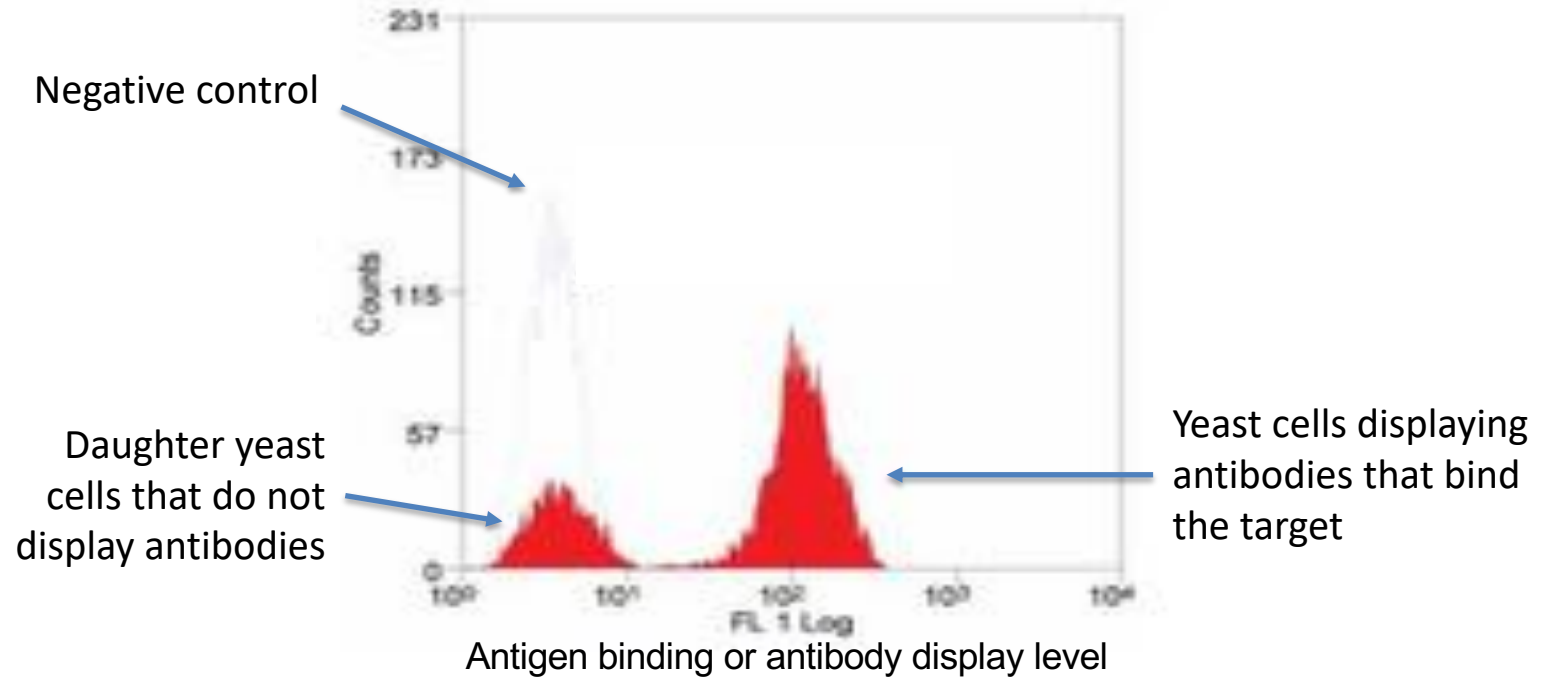
Clone VH and VL directly into yeast together using gap repair:



- Double cut vector
- Generate PCR fragments with > 25 bp overhang
- Mix vector & insert and transfect
- Efficiency 1->100E6/ug insert
- Can use 3 or more fragments
- Useful for chain shuffling

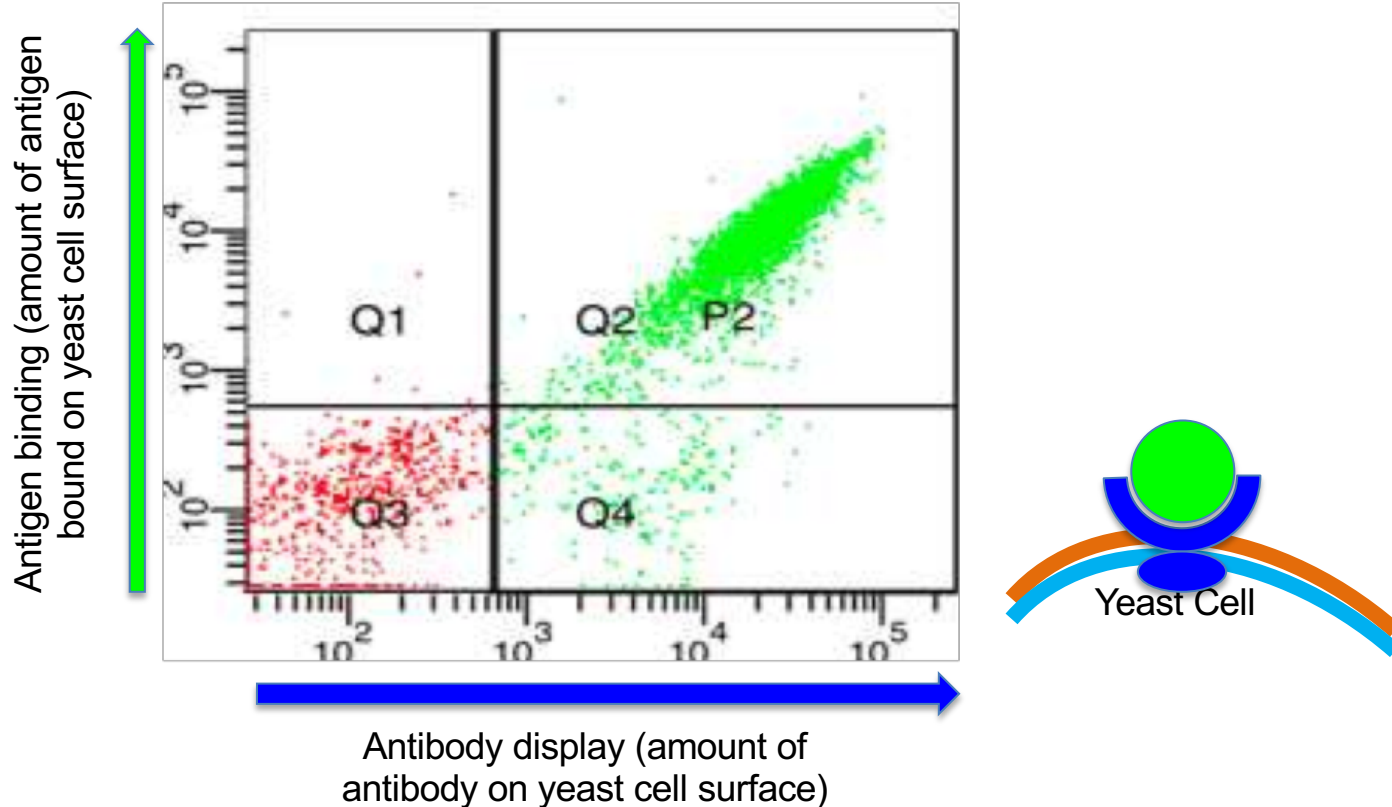
Selecting from yeast display libraries

# Display level and antigen binding vary per yeast





# Interpreting antibody yeast display flow cytometry plots

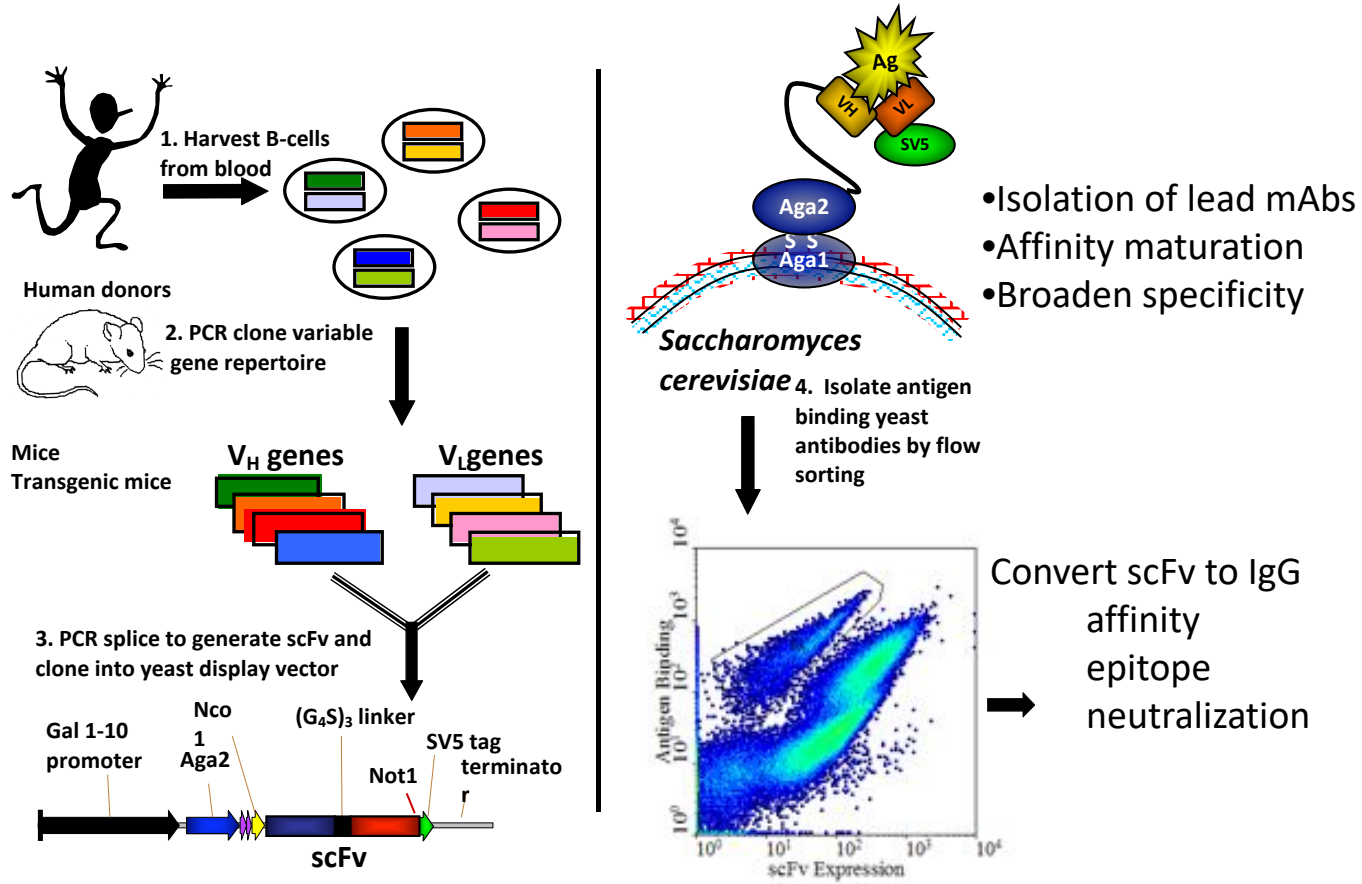


Example of selecting botulinum neurotoxin specific  
scFv from immune yeast display libraries

# Botulinum Toxin: Molecular Structure



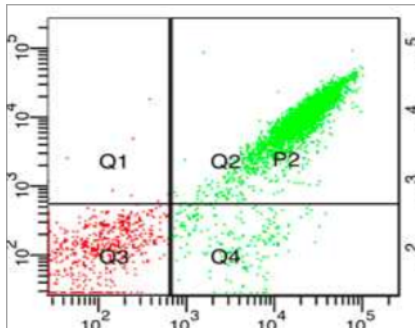
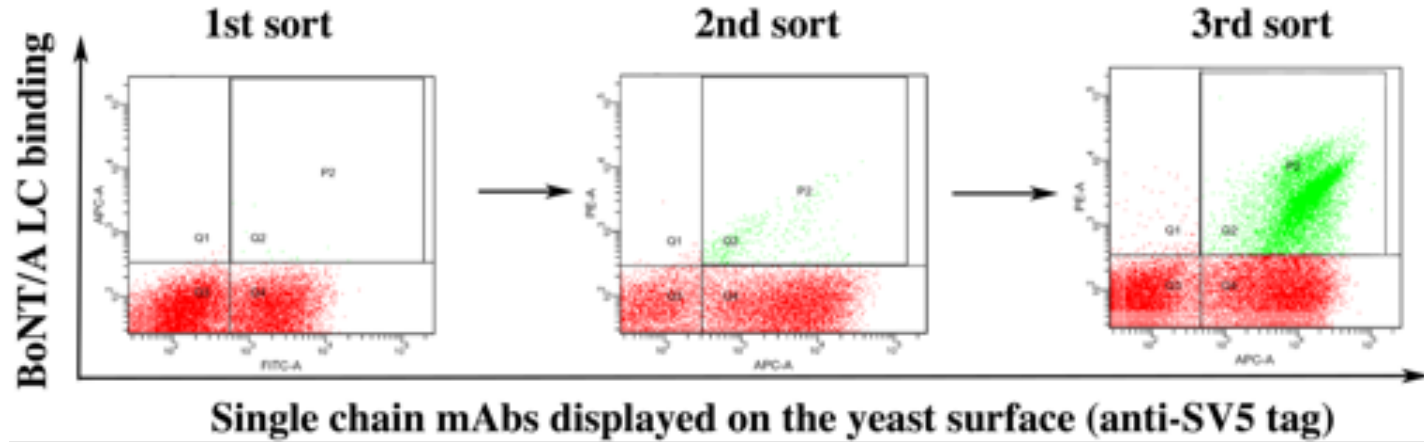
# Studying the human immune response to BoNT by making mAbs and dissecting the structure/function relationship



- PCR amplify VH and VK genes using human or murine family based primers

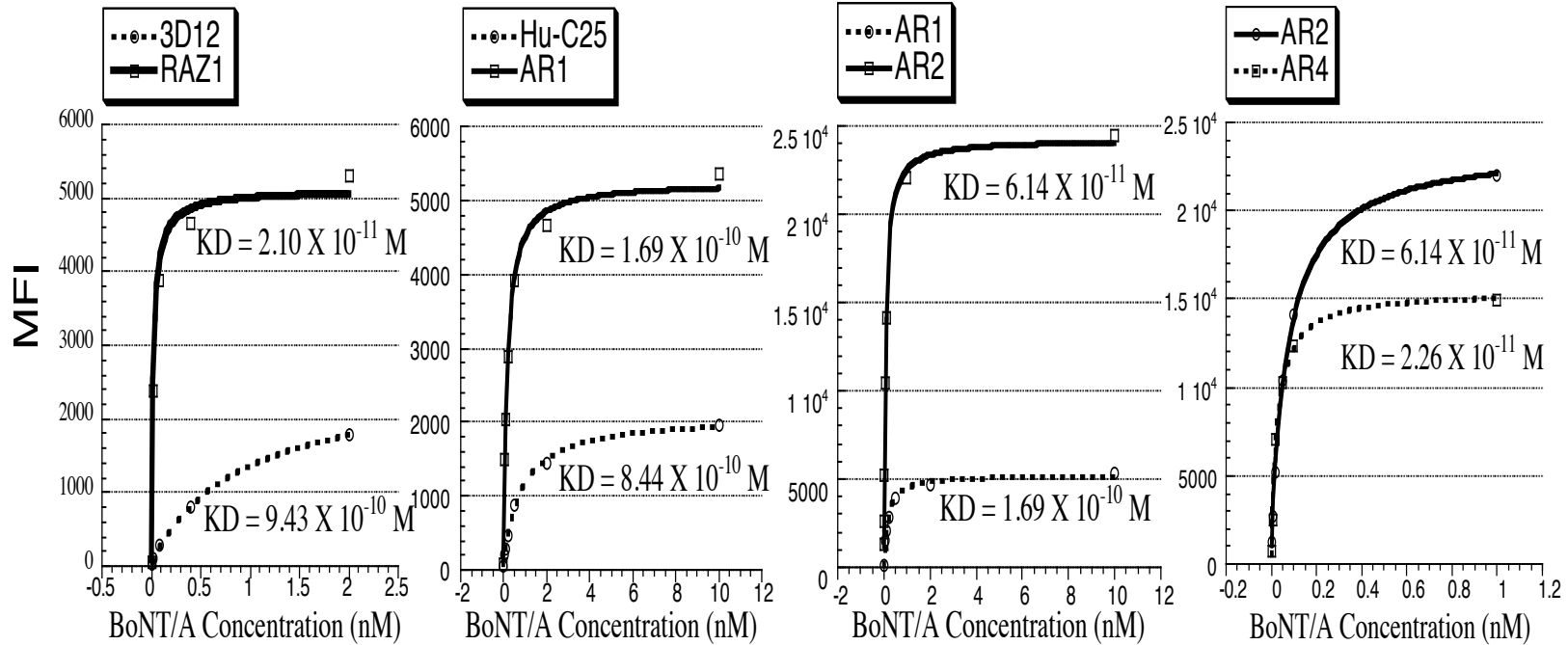


# Selecting yeast antibodies by flow cytometry

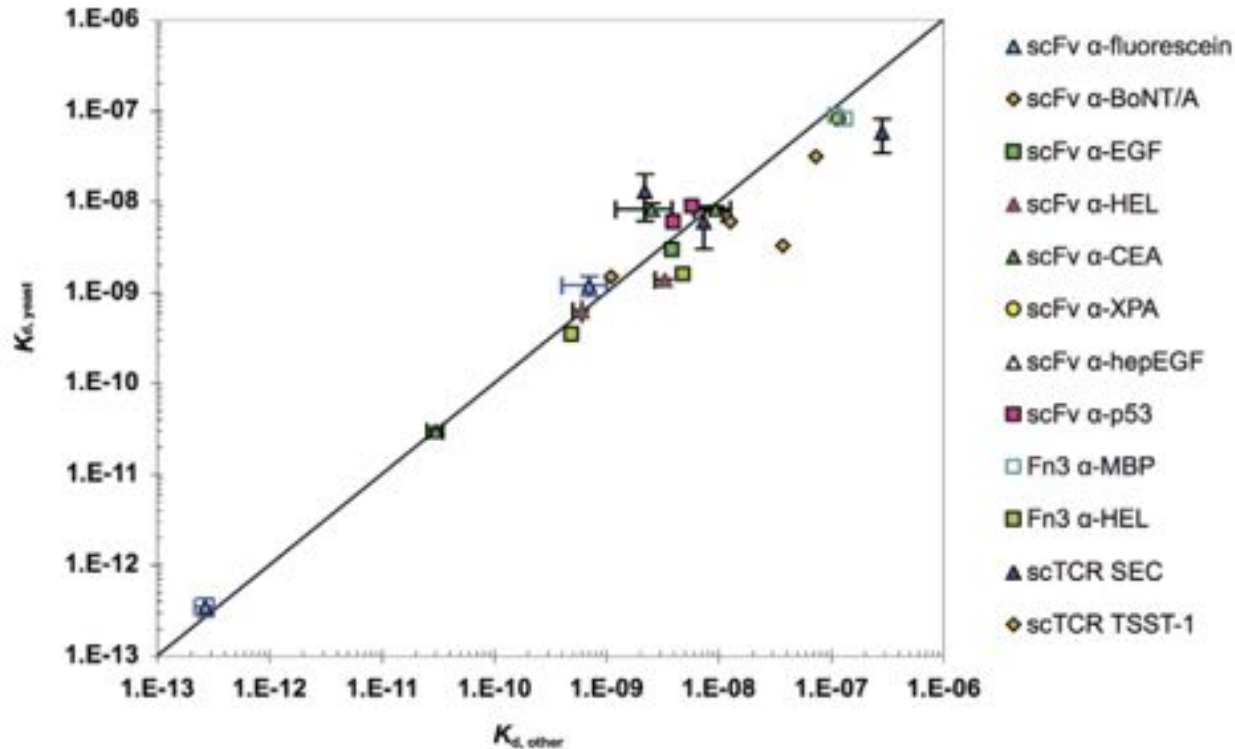


- scFv mAb dot plot
- normal distribution of binding/display
- Need to be mindful of this in setting library sort gates
  - esp. in initial rounds from 1<sup>o</sup> libraries
  - Need to separate clones for affinity maturation

# Measuring KD's of yeast displayed scFv

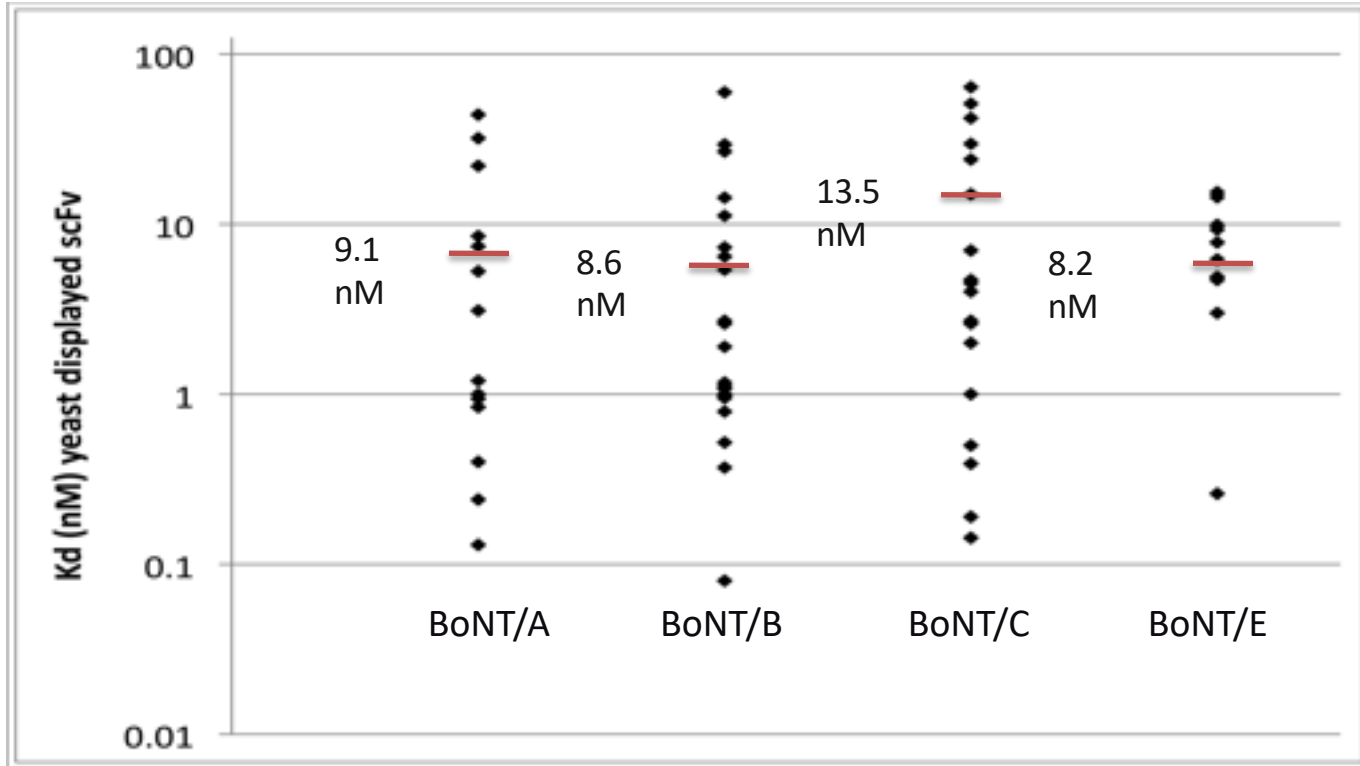


# Measurement of antibody affinity directly on the yeast surface: correlation with other methods



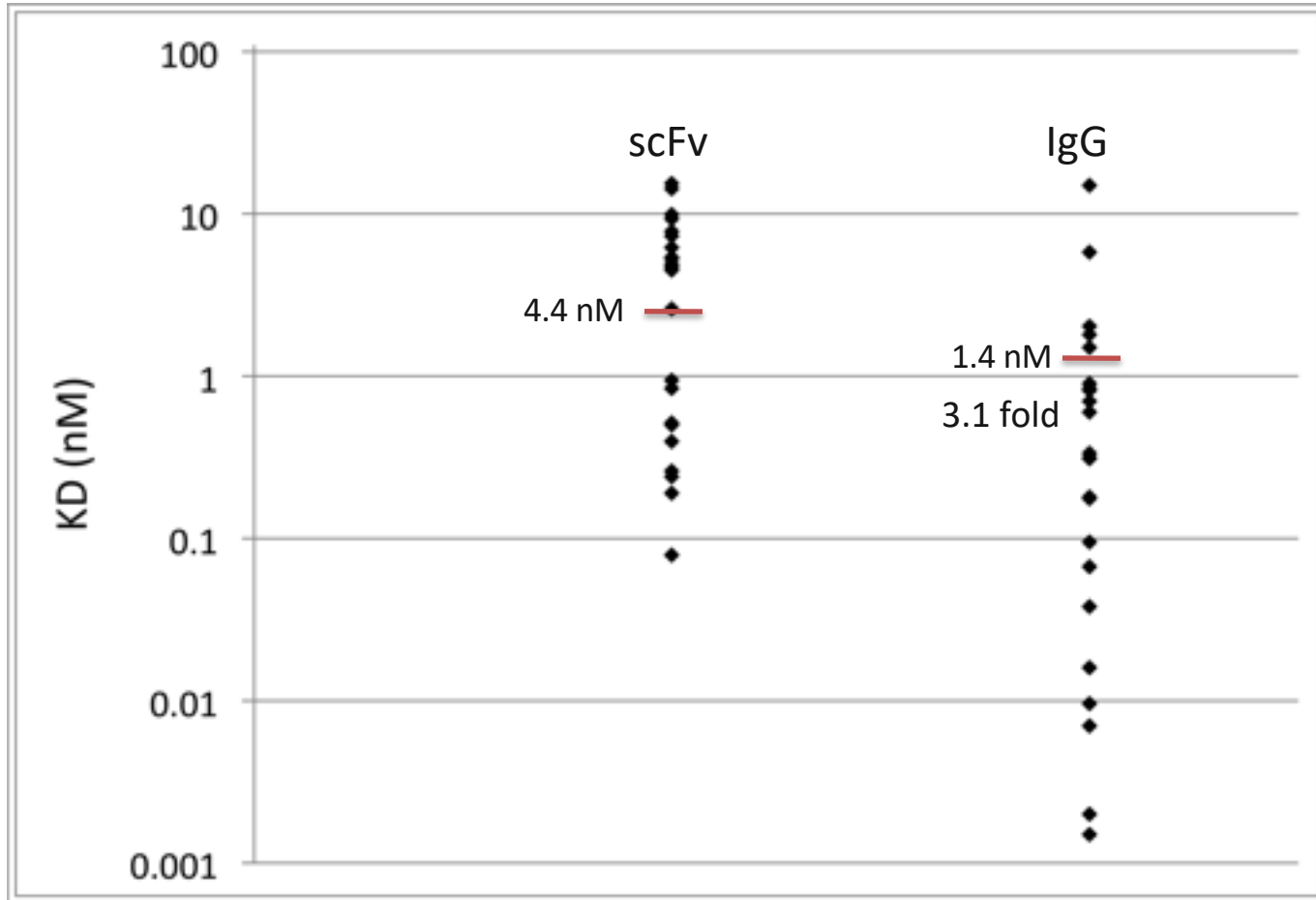


## Yeast displayed BoNT scFv (n = 66)



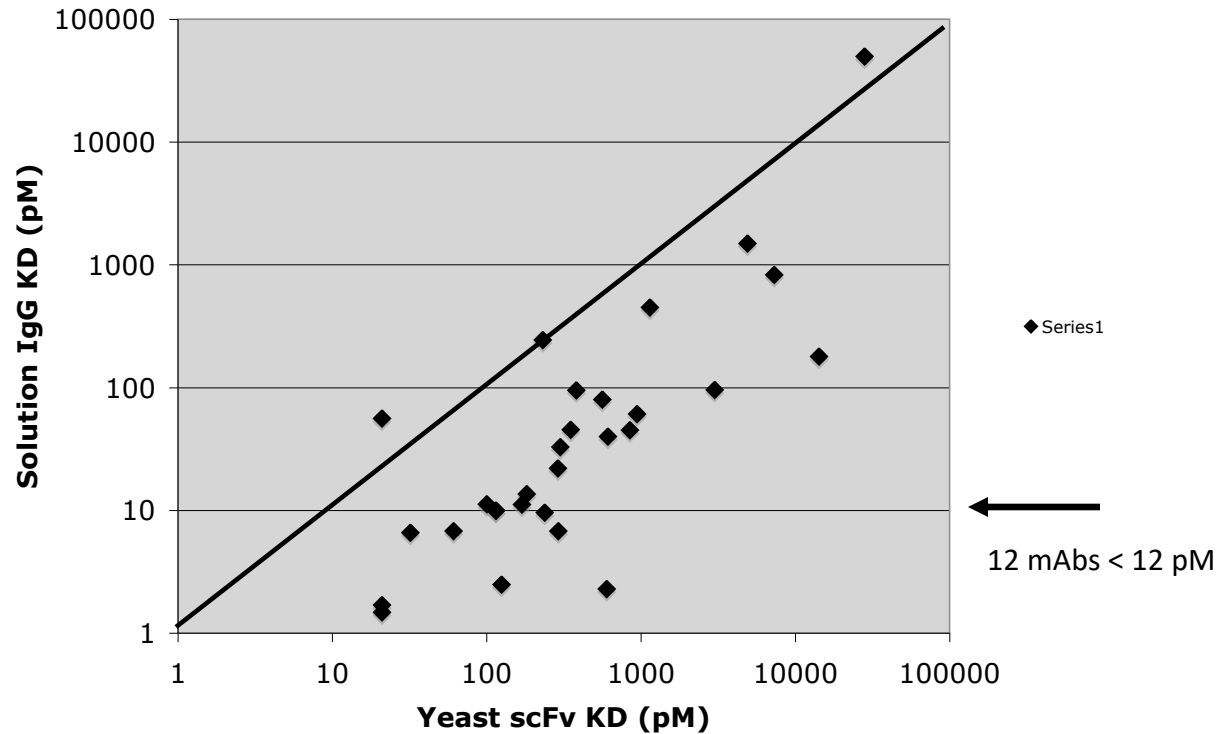
Repertoire usage: VH1: 29%; VH2: 4%; VH3: 50%; VH4: 14%; VH5: 3%  
Vk1: 50%; Vk2: 6%; Vk3: 22%; Vk4: 4%; VJ1: 12%; VJ3: 6%

# Affinities of lead BoNT scFv and their IgG (n = 23)

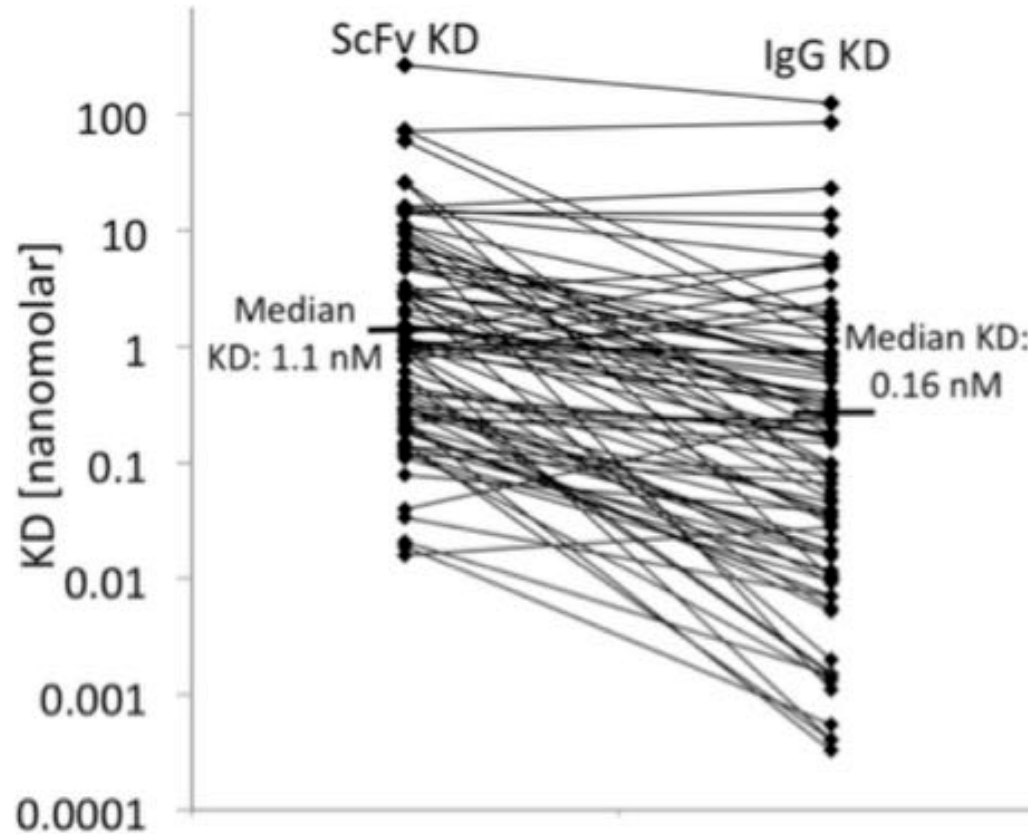


# Affinities of BoNT yeast displayed scFv and IgG in solution

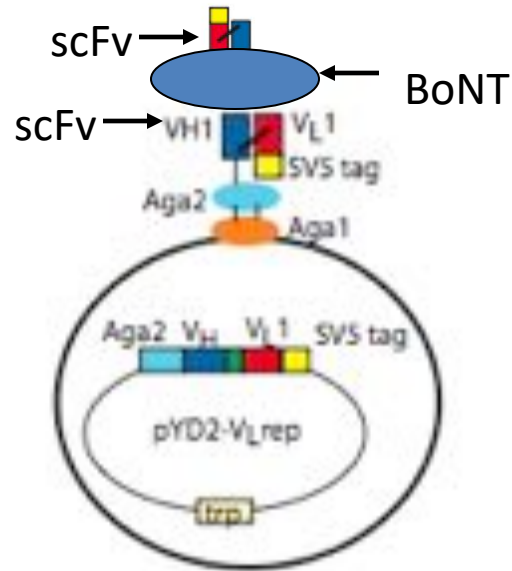
12 primary libraries, 30 secondary libraries: 30 scFv converted to IgG



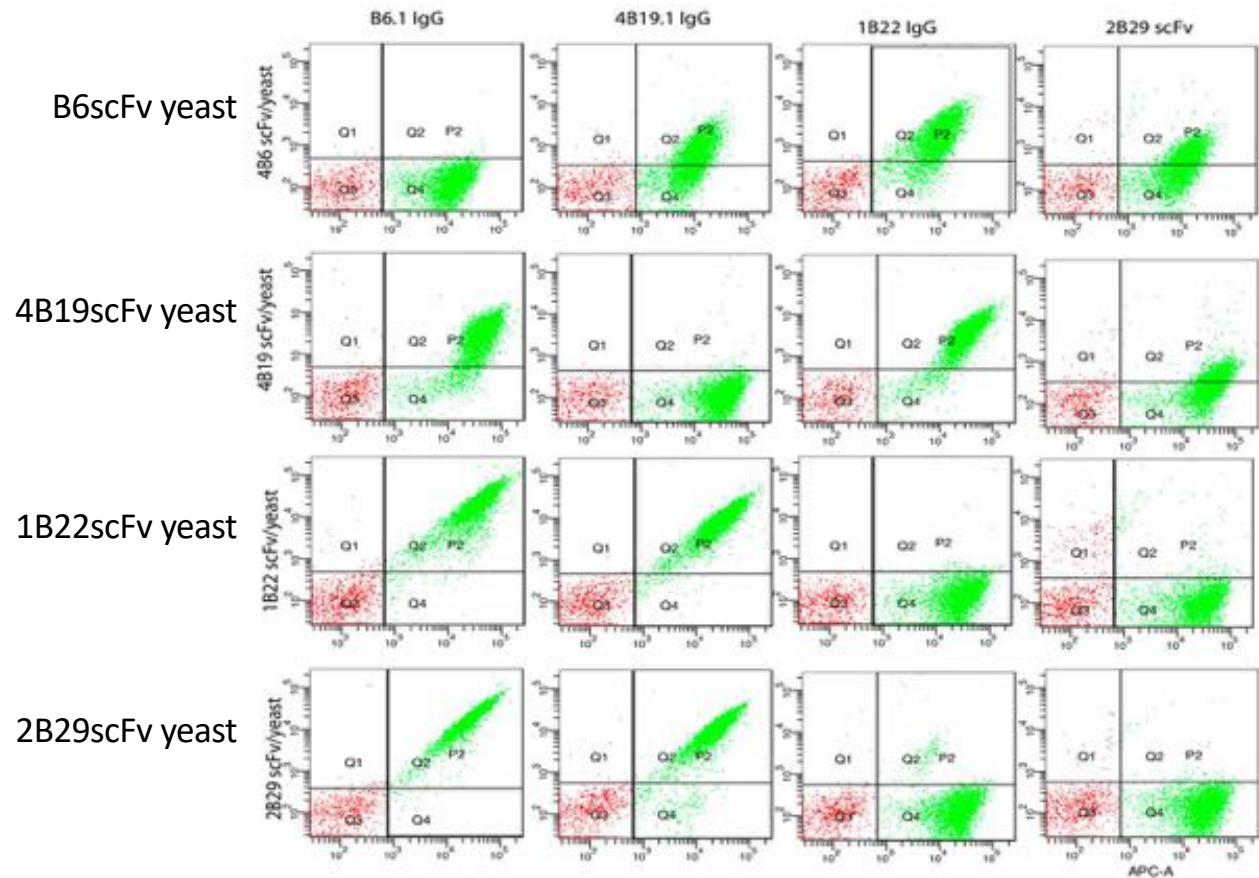
# Affinities of scFv converted to IgG (85 scFv)



# Mapping antibody epitopes for overlap



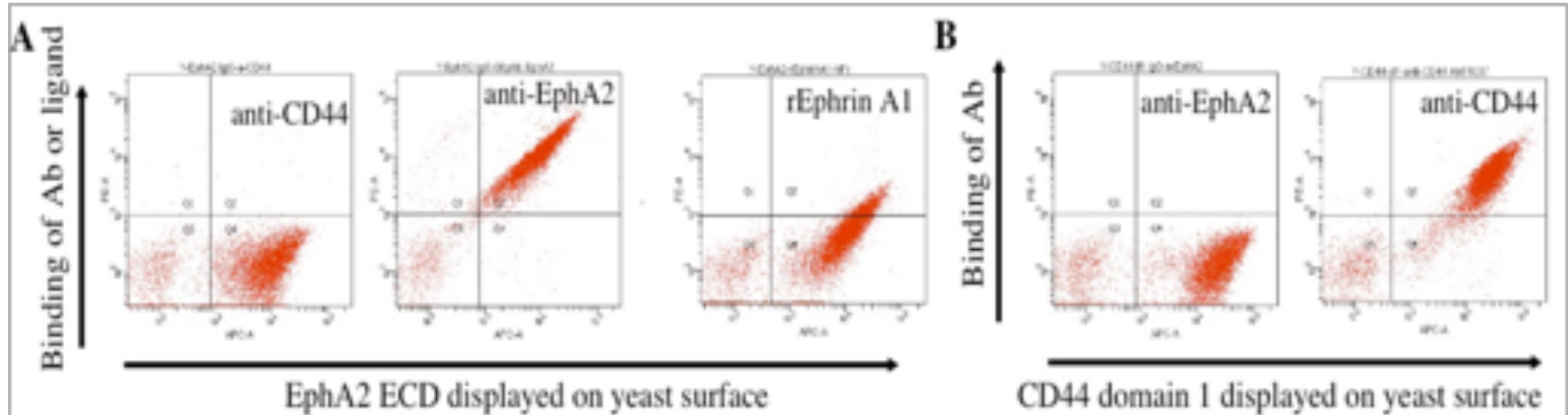
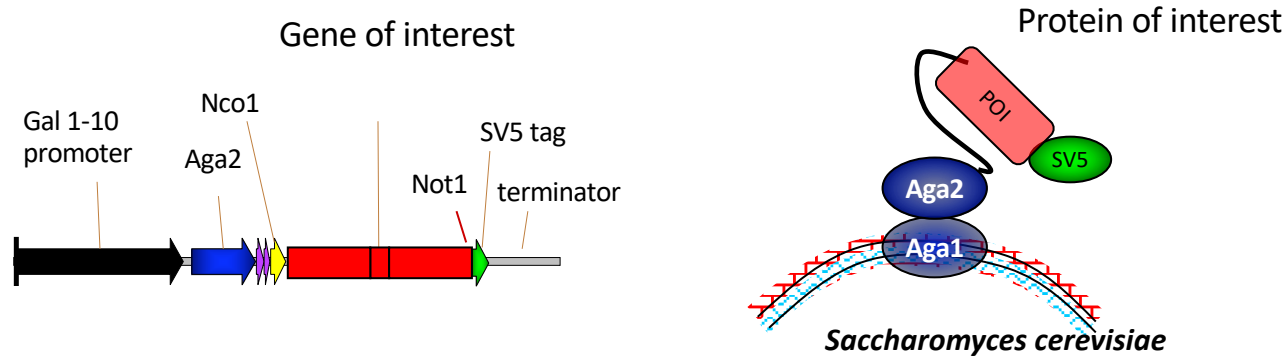
# Epitope mapping antibodies by flow cytometry



# Antigen yeast display

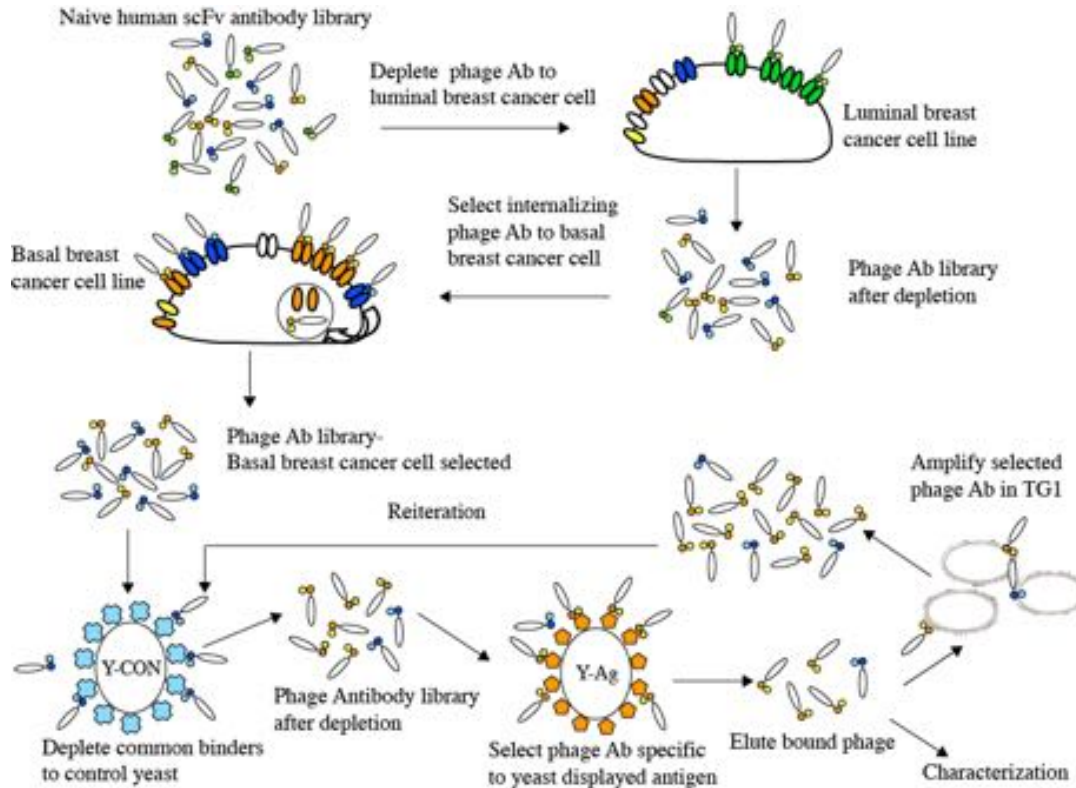
- Use to domain and fine epitope map antibodies
- Use to select phage antibodies

# Antigen yeast display

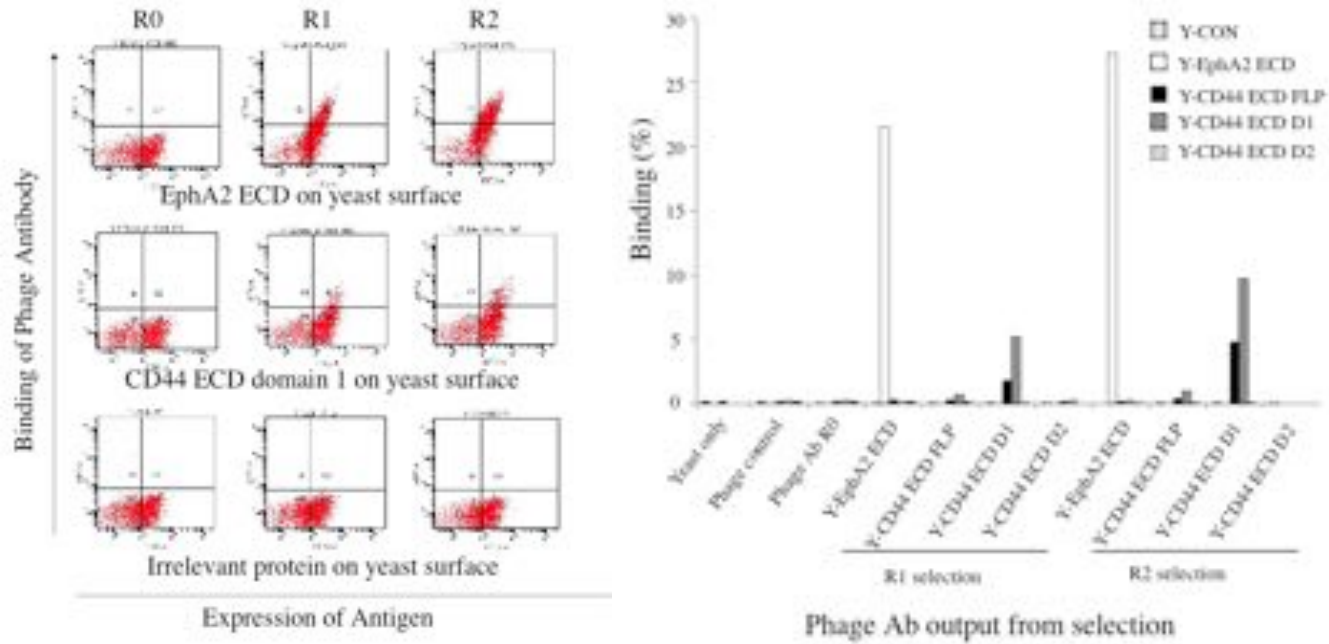




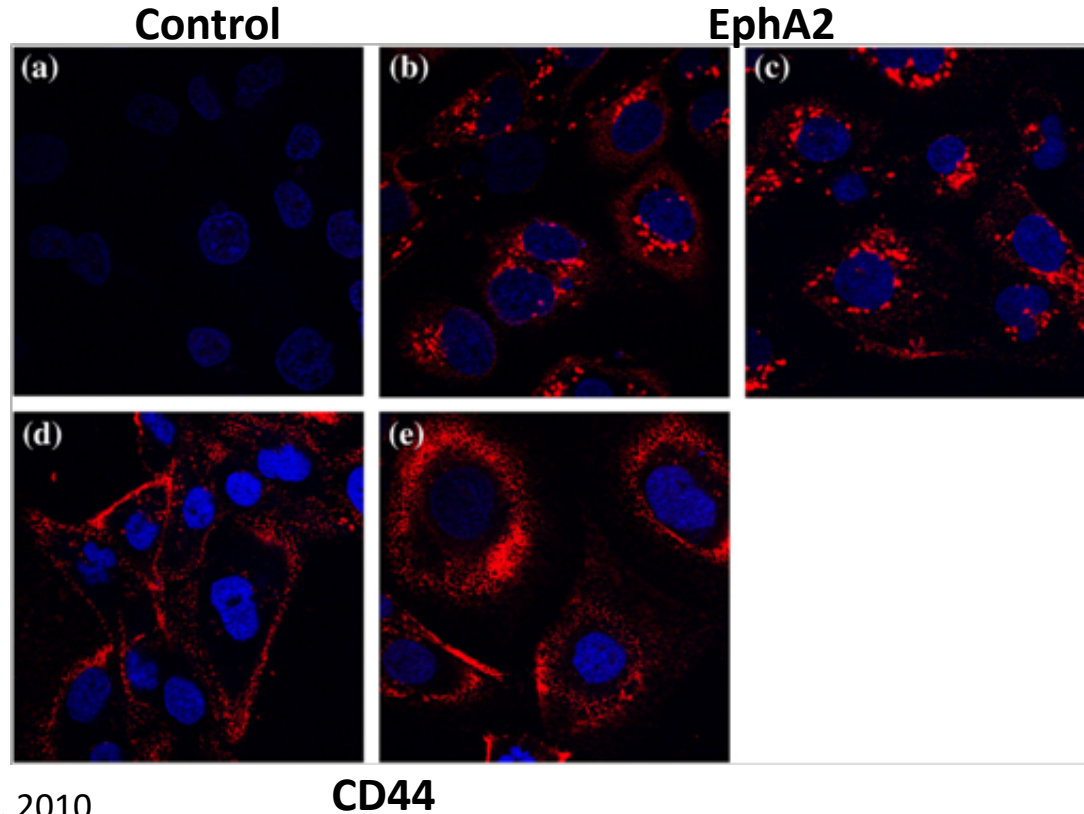
# Yeast displayed antigen combined with cell selection



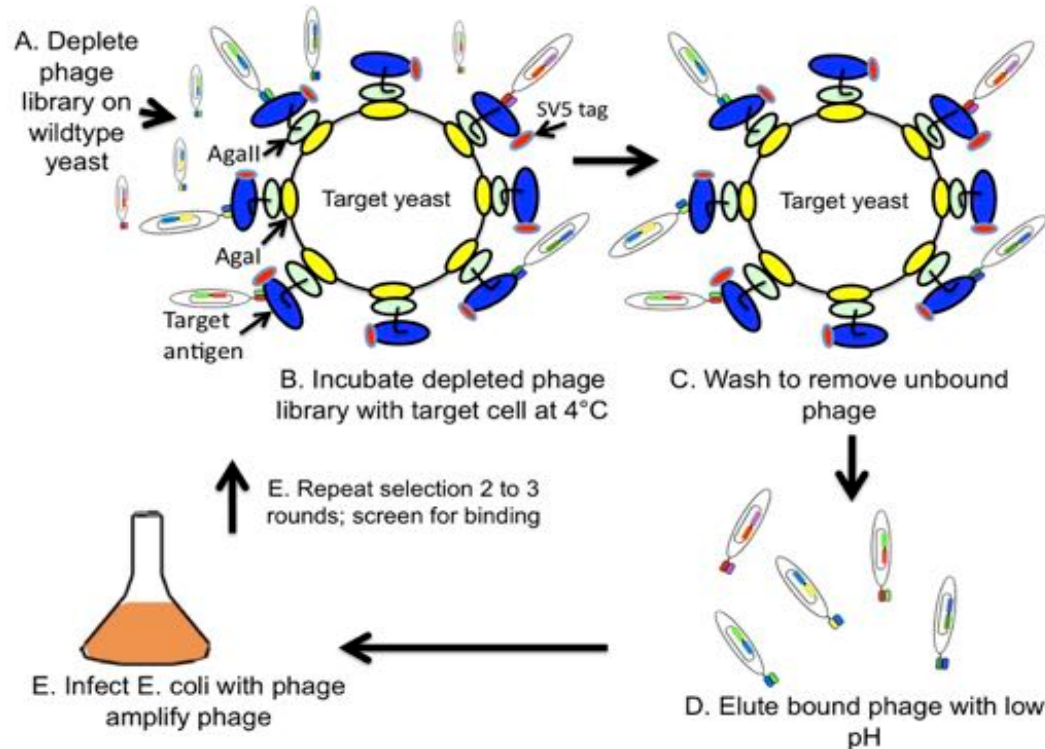
# Enriched Phage Abs on Yeast displayed Ags



# Internalizing mAbs to Basal Breast Cancer Cells



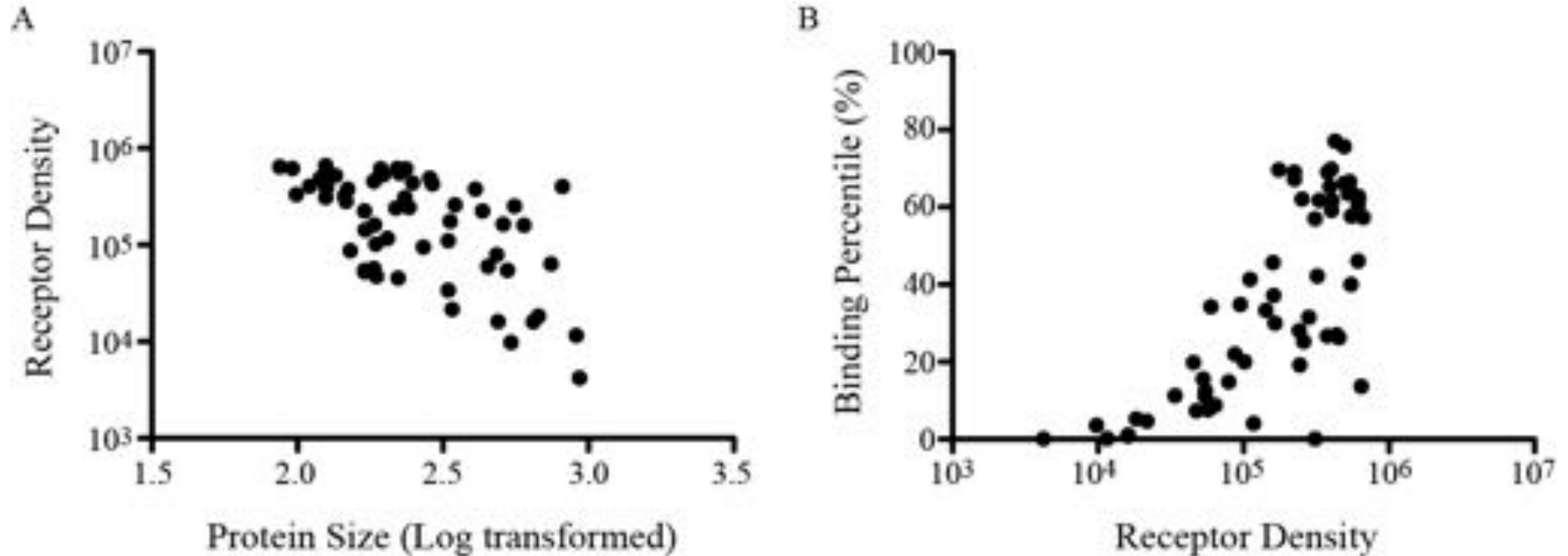
# Yeast displayed Ag Used for High Throughput Phage Ab Selection



# Selected Secretome for Yeast Ag Display and Phage Ab Selections

Gene Name	Display	Domain Classes	Yeast Display Strategy (# residues displayed)
EGFR	Type 1 TM	Receptor L domain, Furin-like cysteine rich region, Furin-like repeats	4 Individual domains (185, 125, 171, 135)
HER2	Type 1 TM	Receptor L domain, Furin-like cysteine rich region, Furin-like repeats	4 Individual domains (193, 126, 170, 145)
HER3	Type 1 TM	Receptor L domain, Furin-like cysteine rich region, Furin-like repeats	4 Individual domains (187, 124, 170, 147)
HER4	Type 1 TM	Receptor L domain, Furin-like cysteine rich region, Furin-like repeats	4 Individual domains (183, 125, 170, 152)
EPHA2	Type 1 TM	Ligand Binding Domain, SAM (Sterile alpha motif), FN3 domain	Full-length ECD (510)
EPHB3	Type 1 TM	Ligand Binding Domain, SAM, FN3	Full-length ECD (527)
VEGFR2	Type 3 TM	Ig	ECD (744) & Ig2-3 (204)
FGFR1	Type 1 TM	Ig	ECD (348), Ig1 (87), Ig2-3 (218)
c-Met	Type 1 TM	Sema (semaphorin domain), PSI (Plexin repeat), IPT (Ig-like, plexins, transcription factors)	Full-length ECD & individual domain combinations (489, 908, 271, 340)
MST1R	Type 1 TM	Sema (semaphorin domain), PSI, IPT	ECD & 3 individual domain combinations (933, 647, 222, 330)
ICAM1	Type 1 TM	Ig	Ig1-5 (452) & Ig1 (99)
PECAM	Type 1 TM	Ig	Ig1-2 (236)
VCAM	Type 1 TM	Ig	Ig2-7 (673) & Ig2-3 (197)
EpCAM	Type 1 TM	Thyroglobulin type-1	Full-length ECD (242)
E-Cad	Type 1 TM	Cadherin like domain	Cad domains 1-5 (542), 1-2 (220)
CD44	Type 1 TM	Link domain	7 variant domains (149, 409, 558, 249, 291, 335, 433)
CD47	5 TM	Ig-like V-type	N-terminal ECD 1 (123)
CD73	GPI anchor	N-terminal metallophosphatase domain	Full-length ECD (523)
CD168	GPI anchor	Hyaluronan-binding fragment	63kDa isoform (561)
MSLN	Secreted	No domain superfamily	Cleaved form (285)
MMP9	Secreted	Fibronectin type-II, Hemopexin	82 kDa (601) & FNII 1-3 (184)
TIMP1	Secreted	NTR	Full-length protein (183)
TIMP2	Secreted	NTR	Full-length protein (193) & NTR (125)
Robo1	Type 1 TM	Ig-like C2-type, Fibronectin type-III	Full-length ECD & individual domain combinations (96, 110, 330, 484, 814)

Many proteins display on yeast and can be used to select antigen specific mAbs



Mammalian cell display

# Advantages of mammalian cell display

- Screen 10's millions clones
- Gain info on expression level, affinity and specificity
- Appears to provide information on antibody developability
  - More developable antibodies appear to display better
- Ability to work in IgG format
- Potential for screening directly for function in mammalian cells
- Screen directly in production cell type used for IgG production



# Challenges in mammalian cell display

- Making large libraries
  - Transformation efficiency much lower than bacteria or yeast
- Genotype phenotype coupling
  - Standard transfection/electroporation integrates antibody genes as a linear array with variable copy number of the transfected transgene
    - Results in multiple different antibody genes into each cell
    - Expression of multiple distinct antibodies per cell
    - Mixing of different heavy and light chain monomers for IgG or Fab formatted libraries
    - Co-isolation of many passenger antibody genes
    - VH and VL genes on separate plasmids
- Slow growth rate
  - 24 hour doubling time

# Solutions to the multiple gene problem: Vector mediated display

- Episomally replicating vectors
  - EBV origin based
  - Eventually resolve into a cell population with limited number of antibody genes per cell
  - HEK cells
  - Simultaneous display and secretion
    - Lox mediated removal of tm domains to allow secretion
    - Alternative splicing to remove tm domains
  - Inducible AID allows somatic hypermutation
- Standard expression vectors
  - Transient transfections
    - Plasmids need to be isolated after each selection round
    - HEK cells
      - Separate VH and VK libraries as full length with murine H2K tm region
      - scFvs with PDGFR tm
    - Each round takes ~7 days
  - Stable transfections
    - Suitable for multiple rounds of selection
    - Small libraries
    - Takes longer

# Solutions to the multiple gene problem: viral vectors

- Retrovirus
  - Separate VH and VK libraries in retroviruses
    - Full length IgG
    - IgM tm region
    - VH and VK are not linked, so binding specificity needs to be recreated
- Sindbis virus
  - scFvs fused in frame with PDGFR beta chain tm domain
    - VH and VL recloned as full length IgGs after selection
- Vaccinia
  - Phage display like selection on surface of vaccinia virus
  - After infection into mammalian cells, mammalian display
  - Separate VH and VK libraries
    - Full length IgG
    - IgG tm region
    - VH and VK are not linked, so binding specificity needs to be recreated

# Solutions to the multiple gene problem: genetic approaches

- FLP site specific integration (three different groups)
  - Flp Recombination Target (FRT) inserted into genome
  - Affinity maturation libraries only, not naïve
  - Vector contains two FRT sites allowing site specific genome integration
  - Flp In CHO line (Invitrogen) used
    - Full length IgG
    - VH and VL on same expression vector
    - PDGFR tm domain
    - Promoterless Hygromycin gene
      - Only expressed when integrated in-frame with ATG codon and up-stream promoter of the FRT site within host genome
      - Allows selection of cells expressing antibodies
    - Insertion of part of vector into genome mediated by Flp recombinase
    - Lox sites flanking tm domain allow conversion from display to secretion by cre recombinase expression

# Flp-In system

- 1 pFRT/*lacZeo* is stably transfected into the mammalian cells of interest to generate the Zeocin-resistant Flp-In Host Cell Lines(s).

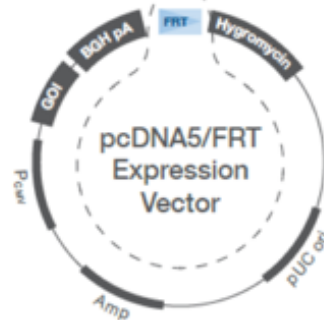


- 2 The pcDNA5/FRT expression vector containing your gene of interest (GOI) is cotransfected with pOG44 into the Flp-In Host Cell Line.

+pOG44  
+pcDNA5/FRT



- 3 The Flp recombinase expressed from pOG44 catalyzes a homologous recombination event between the FRT sites in the host cells and the pcDNA5/FRT expression vector.

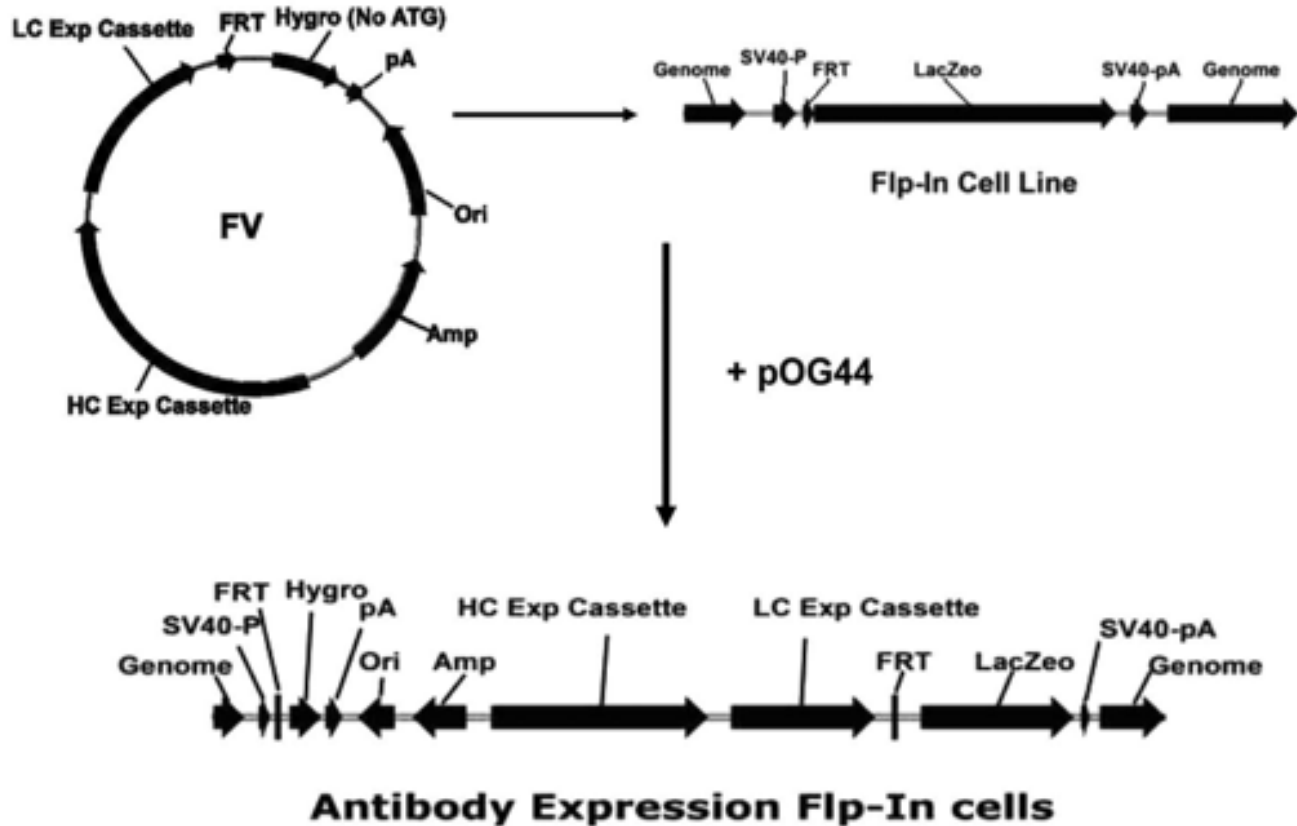


- 4 Integration of the expression construct allows transcription of the gene of interest (GOI) and confers hygromycin resistance and Zeocin sensitivity to the cells.



Flp-In Expression Cell Line

# Applied to antibody display



# Solutions to the multiple gene problem: genetic approaches

- Transposase mediated gene insertion
  - Separate vectors for Transposase, VH and VL
    - Co-transform all vectors
      - Hyperactive piggyback transposase transfers inserts VH and VL expression cassettes into genome
      - Full length IgG
      - VH and VL transcriptional units contain downstream IRES and downstream hygromycin B and puromycin
  - Membrane bound and secreted IgG produced by natural alternative splicing between CH3 and membrane domain

# Solutions to the multiple gene problem: genetic approaches

- Talen mediated integration (McCafferty)
  - AAVS locus targeted (McCafferty)
    - Maxcyte based transfection
  - scFv or full length IgG integrated
  - Output from phage selections
  - More recently carried out with CRISPR-Cas9
- CRISPR-Cas9 mediated integration
  - Hybridoma engineered to remove VL locus, and replace VH locus with ruby RFP (Reddy)
  - Reprogrammed to express full length antibodies with CRISPR-Cas9
    - Inserted construct: VK-CK (2A peptide) VH-CH1
    - VH-CH1 upstream of genomic CH2-CH3 genomic construct
    - Natural alternative splicing produces both displayed and secreted IgG

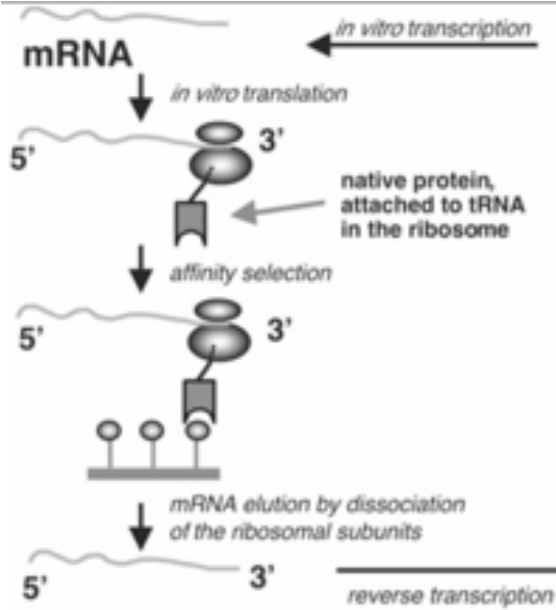


In vitro display methods

# In vitro methods

- For both ribosome and mRNA display
  - Very large libraries –  $10^{12-13}$  molecules
  - Selection acts on single molecules
  - Requires single protein construct
    - scFvs or scFabs, not Fabs or full length IgG
  - PCR step in every cycle introduces in built affinity maturation
    - Selection is stochastic
      - » Repeat selections tend to coalesce around different clonotypes
      - » Each selection gives different solutions
  - Screening requires final output to be cloned into alternative system
    - Expression vector and screening on target
    - Two hybrid system and screening on endogenously expressed protein
- Ribosome display
  - Ribosome acts as link between mRNA and encoded protein
- mRNA display
  - Puromycin acts as link between mRNA and encoded protein

## Ribosome display



DNA

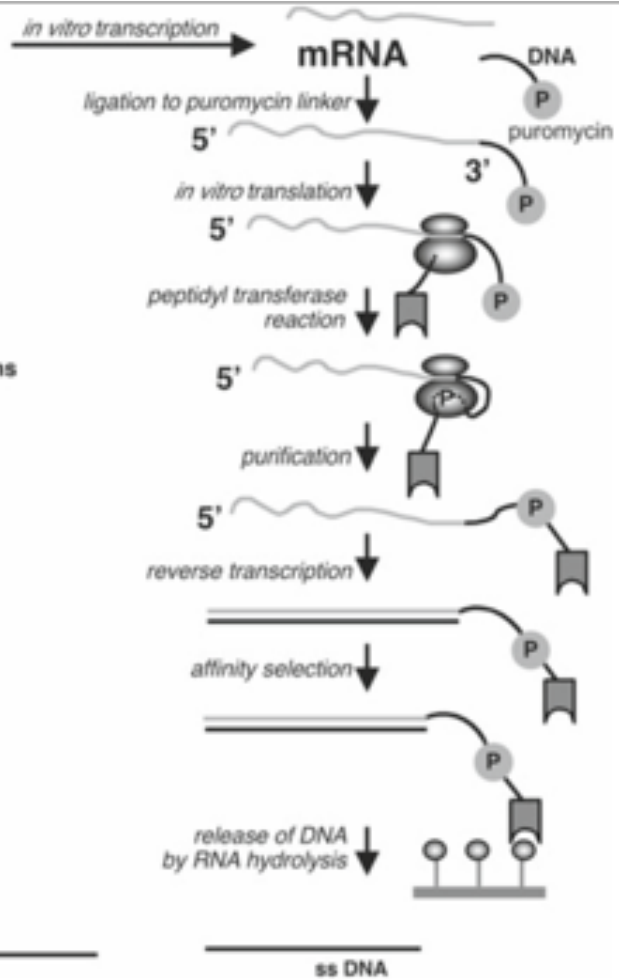
PCR

mutations  
by PCR  
errors

PCR

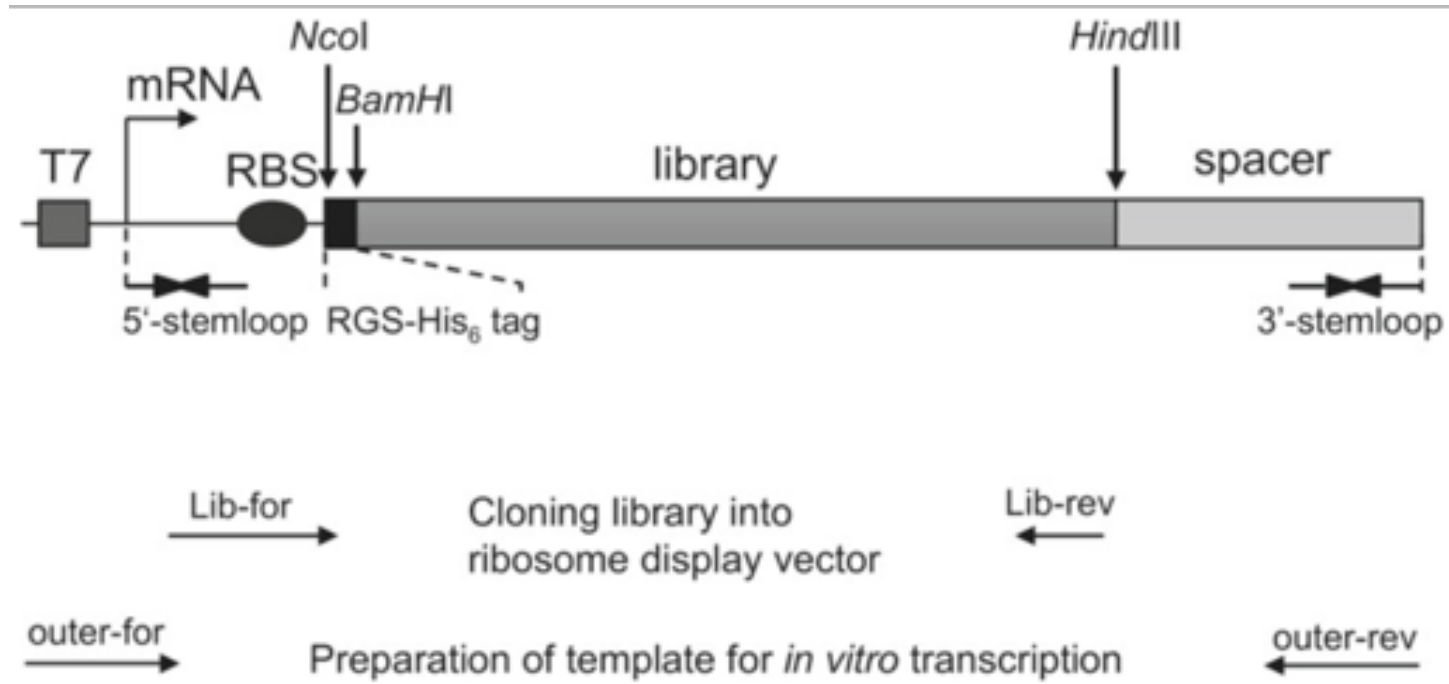
mutations  
by PCR  
errors

## mRNA display



ss DNA

# Construct for ribosome display

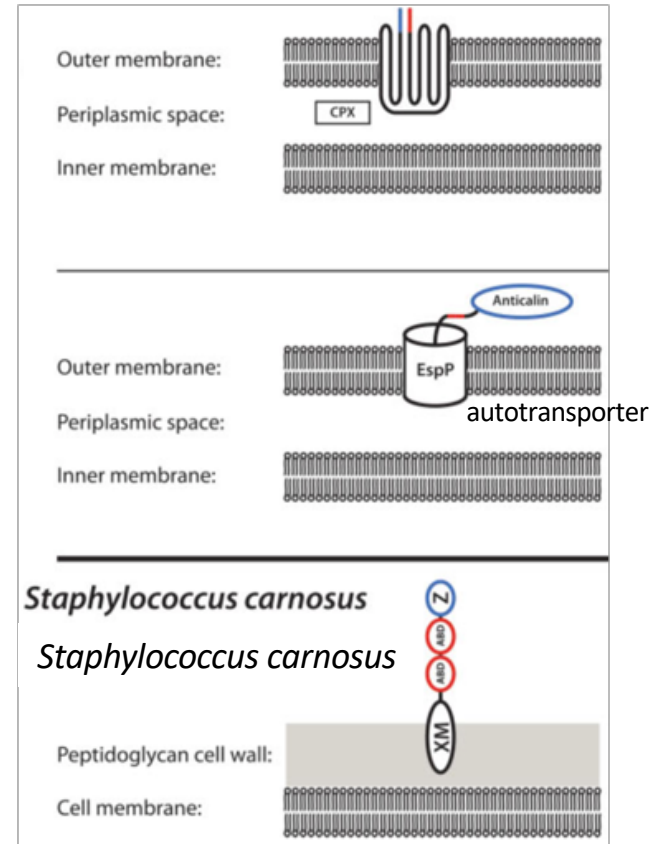
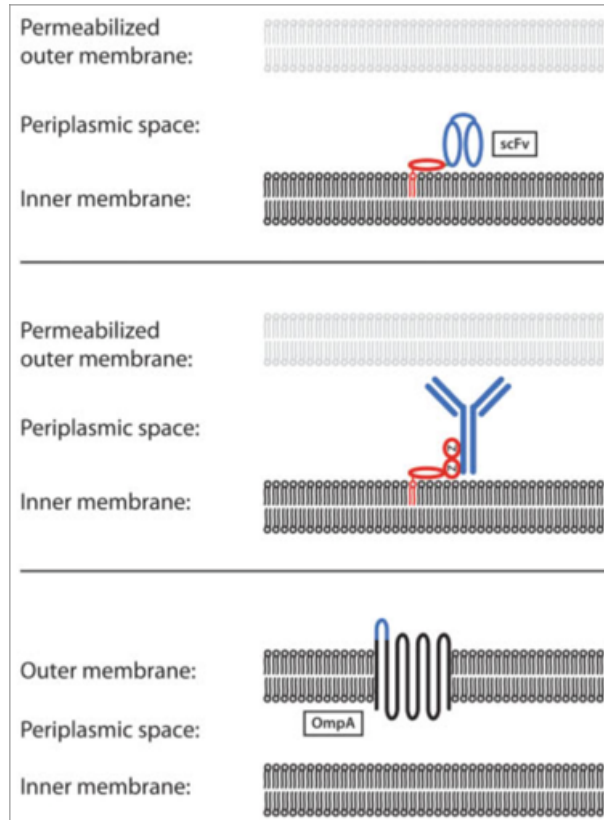


# Bacterial display

# Bacterial display

- Similar advantages to yeast display
  - FACS based selection
  - Analysis of epitopes on surface
- Gram negative
  - All E. coli based
  - Many different systems
    - Fundamental problem is display beyond outer membrane
      - Permeabilization of outer membrane
        - » Requires PCR to rescue antibodies
      - Difficult to display antibodies in intact E. coli
    - Autotransporters solve the problem by using endogenous mechanisms to display
      - Applied to anticalin libraries and many enzymes but not antibodies
      - Difficult to predict which proteins will display
      - Some proteins can be displayed without being folded
- Gram positive
  - S. carnosus most popular
    - Many publications from limited number of groups
    - Main problem is low level of transformation
      - Difficult to generate libraries  $>10^6$  diversity
      - Good for affinity maturation or selection from small libraries
      - Single domain proteins displayed, no scFv
        - » Nanobodies, peptides, affibodies,

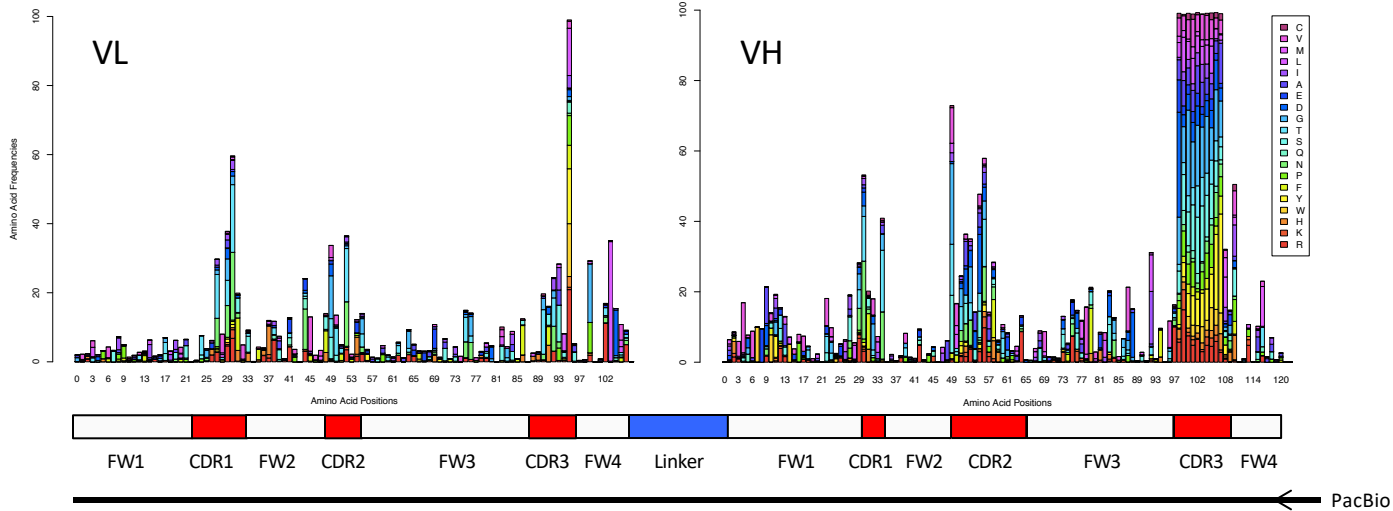
# Bacterial display



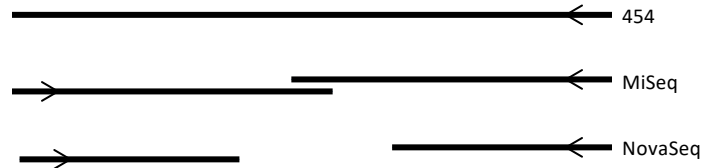
# Next generation sequencing



# NGS platforms and antibodies



- Assess naïve library diversity
- Assess selection outputs



# Comparison of Sequencing Platforms

Platform	Type of sequencing	Max read length (bp)	Throughput	Cost (lowest)	Accuracy	Time	Type of error	Cost per 10 <sup>6</sup> V domains
<u>NovaSeq</u> (Illumina)	2 x 150	300	S4 3.3x10 <sup>9</sup> /lane	~\$24K/lane		40h		\$7.27
	2 x 150	300	S2 10 <sup>9</sup> /lane	~\$8K/lane	>75% at 99.9%	40h		\$8.00
<u>MiSeq</u> (Illumina) v2/v3	2 x 300	600	25x10 <sup>6</sup> /lane	\$3100/lane	>70% reads at 99.9%	55h	Substitution	\$124
	2 x 150	300	16x10 <sup>6</sup> /lane	\$1100/lane	>80% reads at 99.9%	24h		\$78
<u>IonTorrent</u> (LifeTech)- 316	1 x 400	400	2x10 <sup>6</sup> /chip	\$900/chip	> 99%	5 h	<u>InDel</u>	\$450
	1 x 200	200				3 h		
<u>PacBio</u> - RSII	1 x 8500	8500	47,000	\$1050	11-15%	≤4 h	<u>InDel</u>	\$22,340
		e.g. 10 passes of 850 bp			99.999% depends on no. passes			
454 (Roche)- GS-FLWX+	1 x 700	700	50,000 in 1/8 plate	\$2400/1/8 plate	99.997%	23 h	<u>InDel</u>	
	1 x 450	450		\$1900/1/8 plate	99.995%	10 h		\$38,000

# Some considerations on the use of NGS

- Naïve libraries
  - The diversity of most libraries is measured by counting colonies, with claimed diversities  $>10^9$
  - The greatest number of reads possible with NGS is  $3 \times 10^9$  (NovaSeq)
  - Even using NovaSeq most naïve libraries will be undersampled, sometimes massively so
  - NovaSeq can provide a minimum measured diversity
- Selections
  - After selection diversity is significantly reduced (1,000 to 10,000 different sequences)
    - NGS can cover the diversity of an antibody selection output
  - Theoretically<sup>1</sup>
    - Libraries of  $10^{5-6}$  should have enough “shape space” to recognize all antigens (affinity threshold)
  - Practically<sup>2,3</sup>
    - Mean (and median) of 4 antibodies per antigen from libraries of  $\sim 10^7$  antibodies
  - There should be 4,000 - 100,000 different binders from a library of  $10^{10}$  antibodies
    - But usually no more than 30 antibodies in standard selections
    - CAT (now MedImmune) selected >1000 antibodies with >568 different HCDR3s from  $10^{11}$  library against one target (with massive effort)
  - NGS identifies many more antibodies

<sup>1</sup>Perelson & Oster *J Theor Biol* **81**, 645-670, (1979)

<sup>2</sup>Griffiths, *et al. The EMBO journal* **13**, 3245-3260 (1994)

<sup>3</sup>Marks *et al. Journal of molecular biology* **222**, 581-597 (1991).

# Understanding Hamming Distances

Clone Identification at:

HCDR3	Hamming 0	Hamming ≤1	Hamming ≤2	Hamming ≤3
CARLVPETHLRYFDYWG	A	A	A	A
CARLIPETHLRYFDYWG	B	A	A	A
CARLVPDTHLRYFDYWG	C	A	A	A
CARLVPETHIRYFDYWG	D	A	A	A
CARLVPESHLRYFDYWG	E	A	A	A
CARLVPETHLRFFDYWG	F	A	A	A
CARVVPDTHLRYFDYWG	G	B	A	A
CARLVPETHIRYGDYWG	H	C	A	A
CARLVSESHLRYFDYWG	I	D	A	A
CARLVPETRRLRFFDYWG	J	E	A	A
CARLIPETRRLKYFDYWG	K	F	B	A
CARVVPDTHLRYWDYWG	L	G	C	A
CARLVAETHIRYGDYWG	M	H	D	A
CAKLVSESHLRYFDYWG	N	I	E	A
CARLVPETRRLRFFDFWG	O	J	F	A
<b>Total number of clonotypes</b>	<b>15</b>	<b>10</b>	<b>6</b>	<b>1</b>

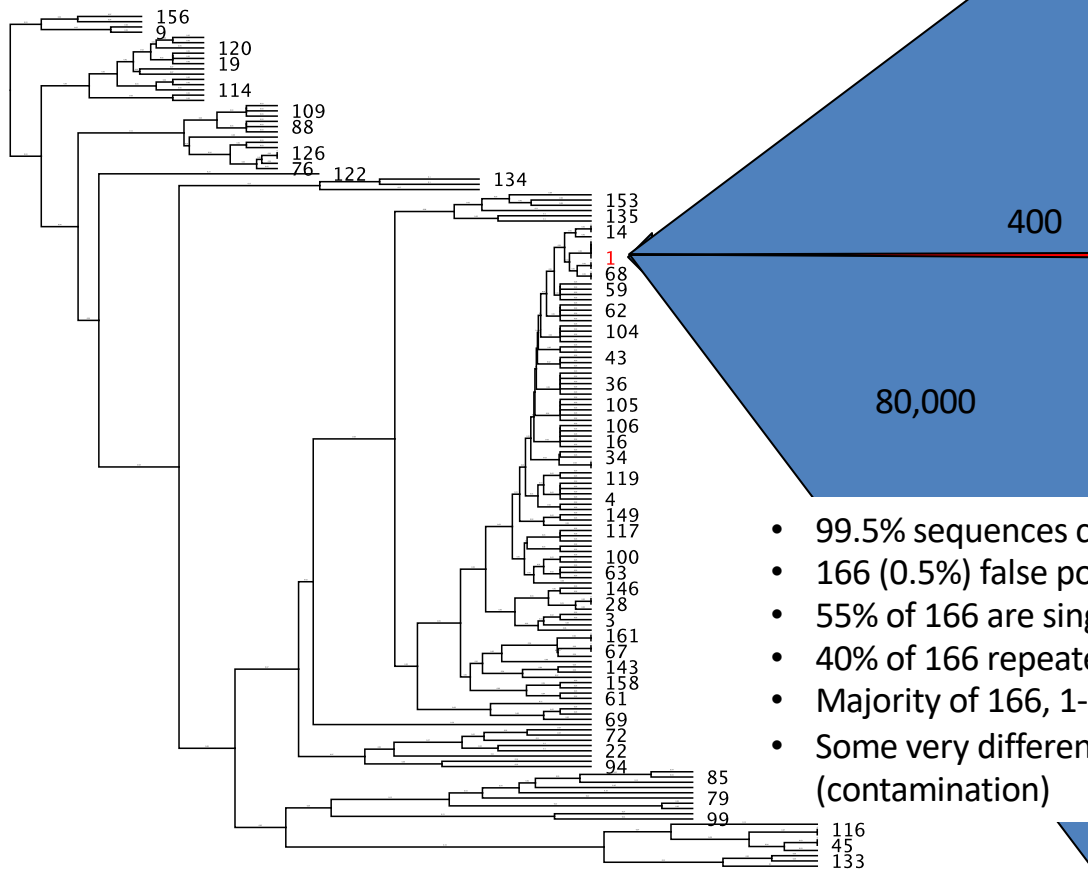
Different  
identified  
clonotypes,  
according to  
specified  
Hamming  
distance

# Naïve library analysis with NGS

# Challenges in using Next Generation Sequencing to assess library diversity

- Error rates
  - Error rates similar to somatic hypermutation rates
  - Most sequences from a given clone are correct
    - Sequence one HCDR3 80,000 times
      - >99.5% correct
      - <0.5% comprise 166 unique false positive HCDR3s
- What constitutes a different antibody?
  - Hamming distance of  $\geq 2$ ?
    - Pure Hamming is probably insufficient
    - Functional Hamming in which amino acids grouped into functional categories probably more appropriate
    - Most measures concentrate on HCDR3 alone
- Read length
  - NGS Doesn't cover full scFv or Fab length
- Read numbers
  - Except for the smallest libraries, NGS will always undersample diversity
  - More data leads to different conclusions

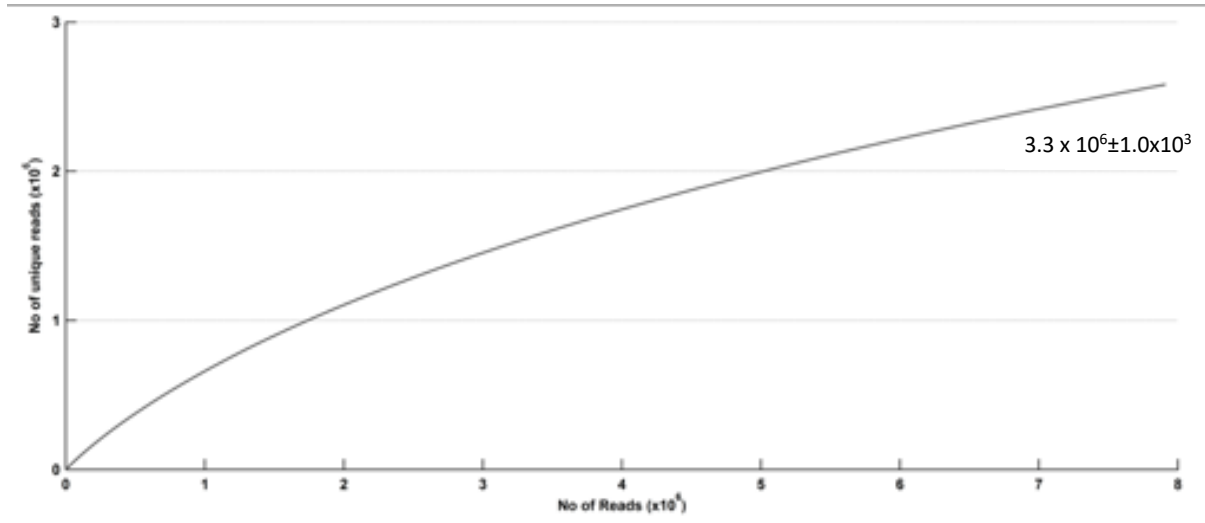
# 166 false positives



- 99.5% sequences correct
- 166 (0.5%) false positives
- 55% of 166 are singletons
- 40% of 166 repeated false positives
- Majority of 166, 1-3 mutations away (contamination)

# Early attempts to assess library diversity with NGS

Accumulation plot observed (unique HCDR3 vs tot. # sequences)

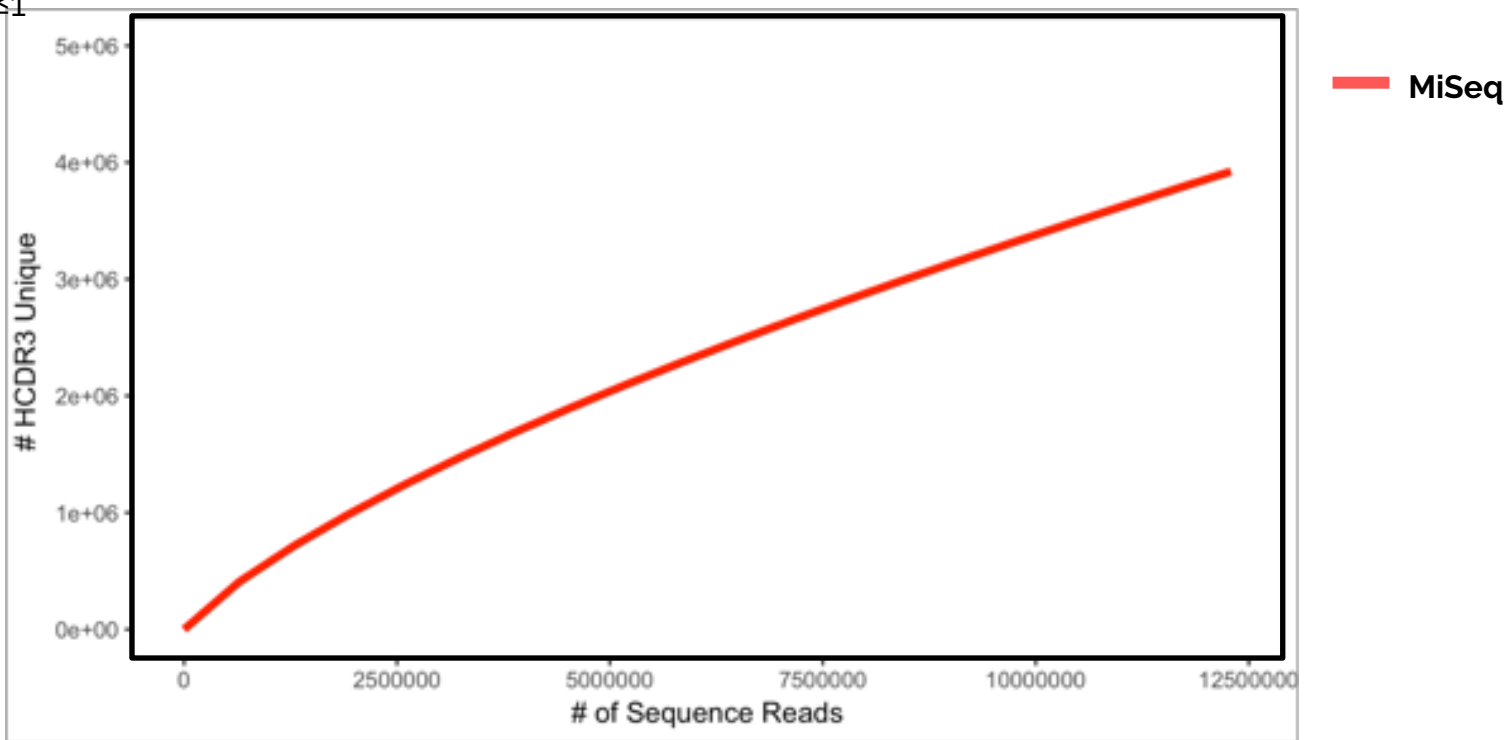


- $10^8$  transformants, if true VH diversity is  $\sim 3 \times 10^6$ , this is  $\sim 30$  fold less than expected on basis of number of transformants
  - Additional diversity in HCDR1/2 not accounted for here
- Glanville, 2009:  $3 \times 10^{10}$  transformants (650 donors), estimated VH diversity (non-redundant capture-recapture)  $2 \times 10^5$ 
  - $\sim 10^5$  less than expected
- The diversity of natural libraries is probably much smaller than that estimated by counting the number of transformants



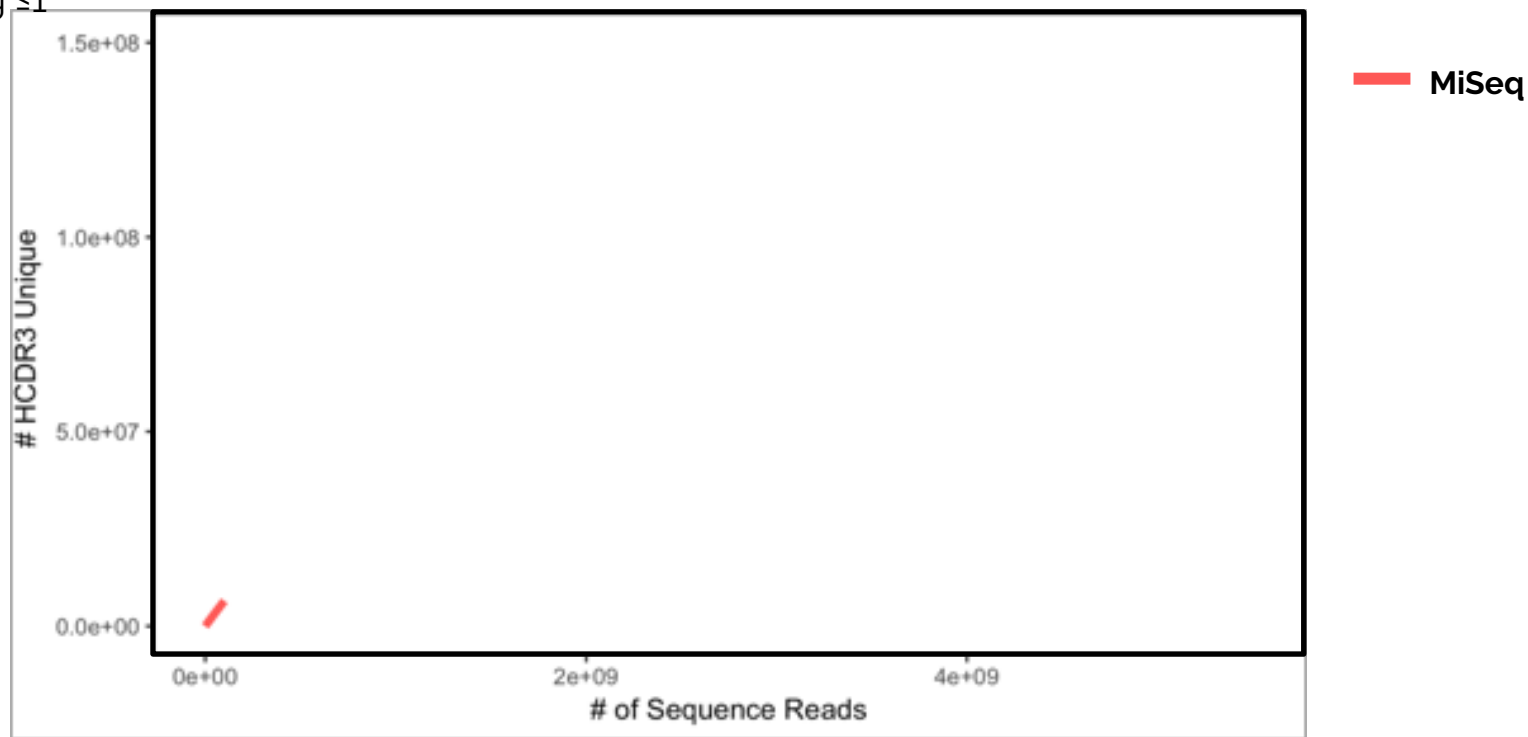
# Measuring HCDR3 Diversity of the single donor library by MiSeq...

Hamming  $\leq 1$   
in HCDR3



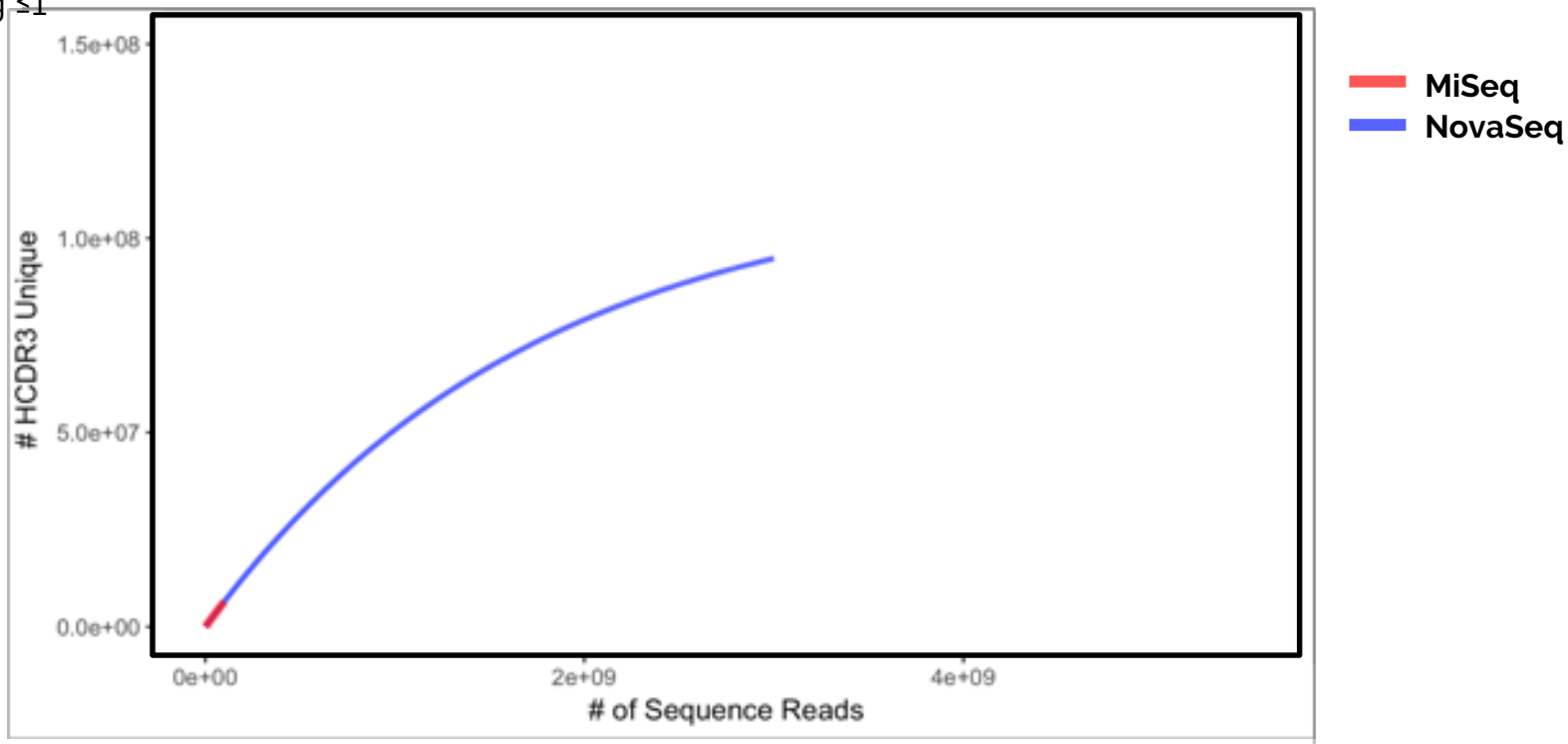
# ...on a NovaSeq Scale...

Hamming  $\leq 1$   
in HCDR3

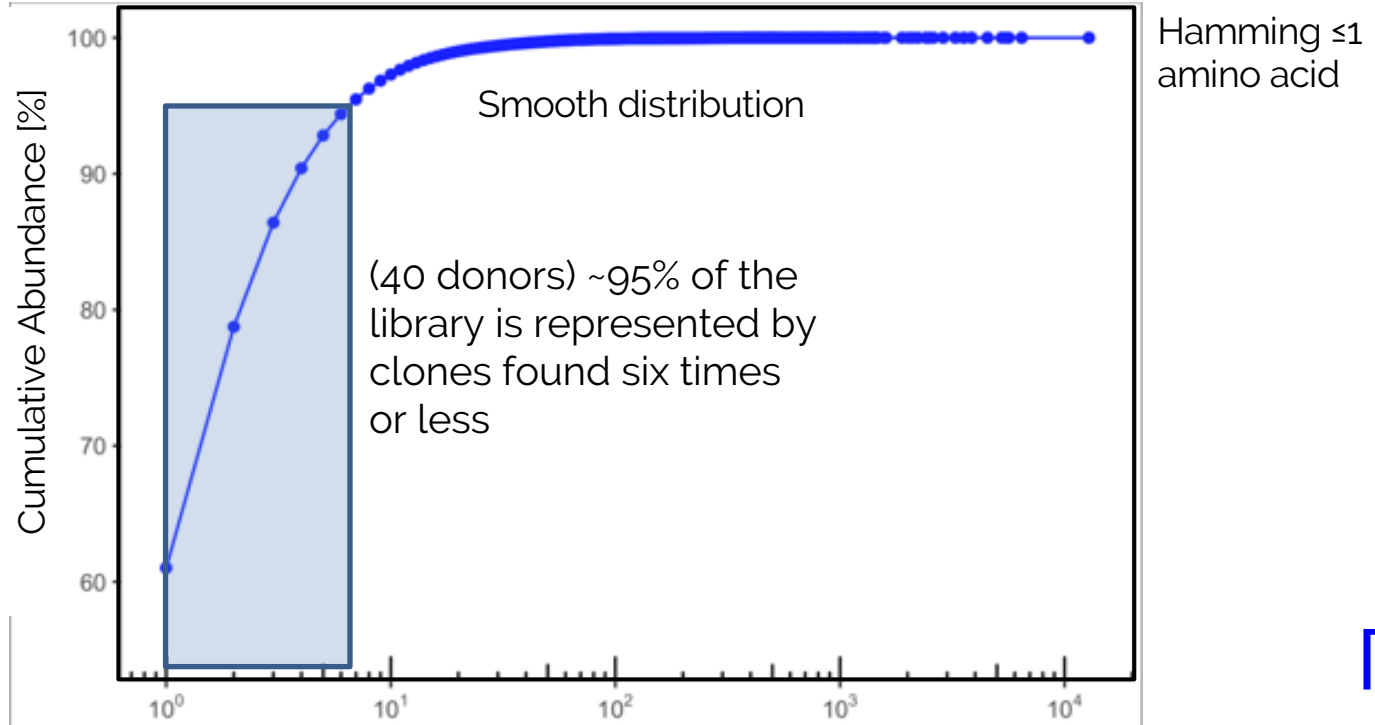


# ...with NovaSeq Sequence

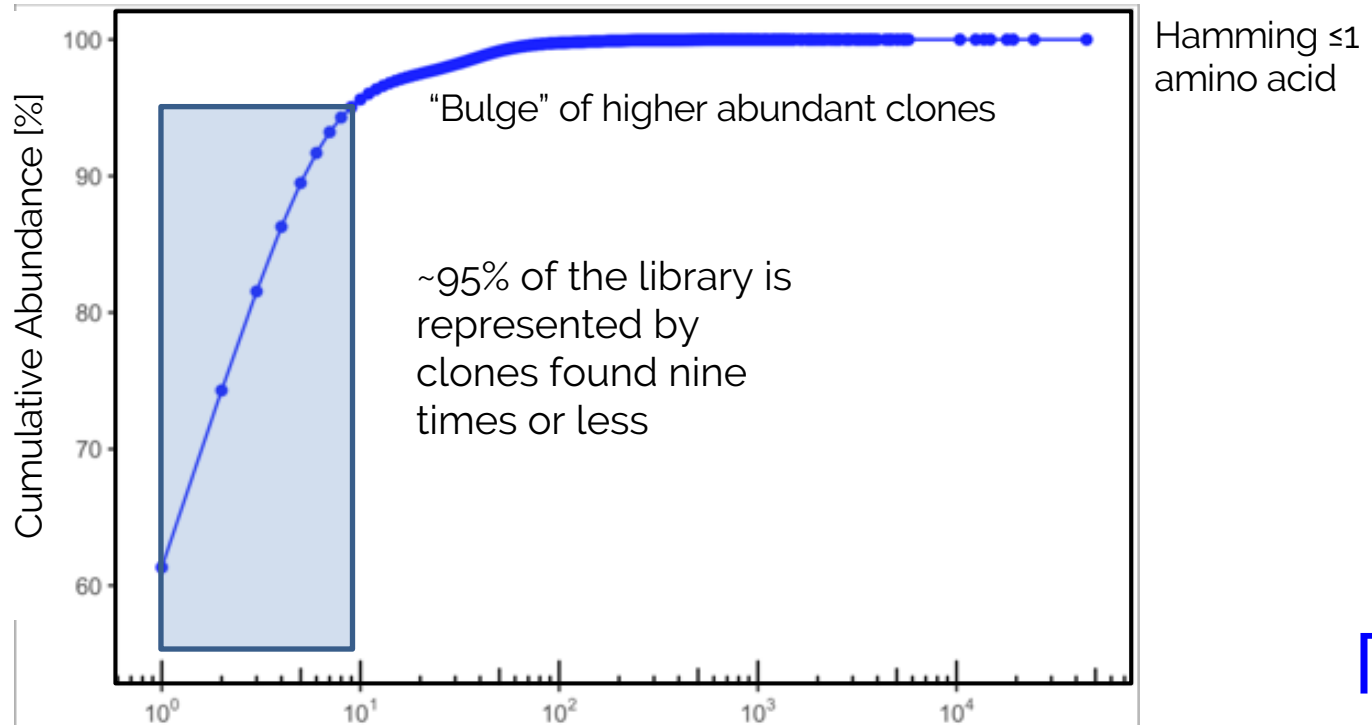
Hamming  $\leq 1$   
in HCDR3



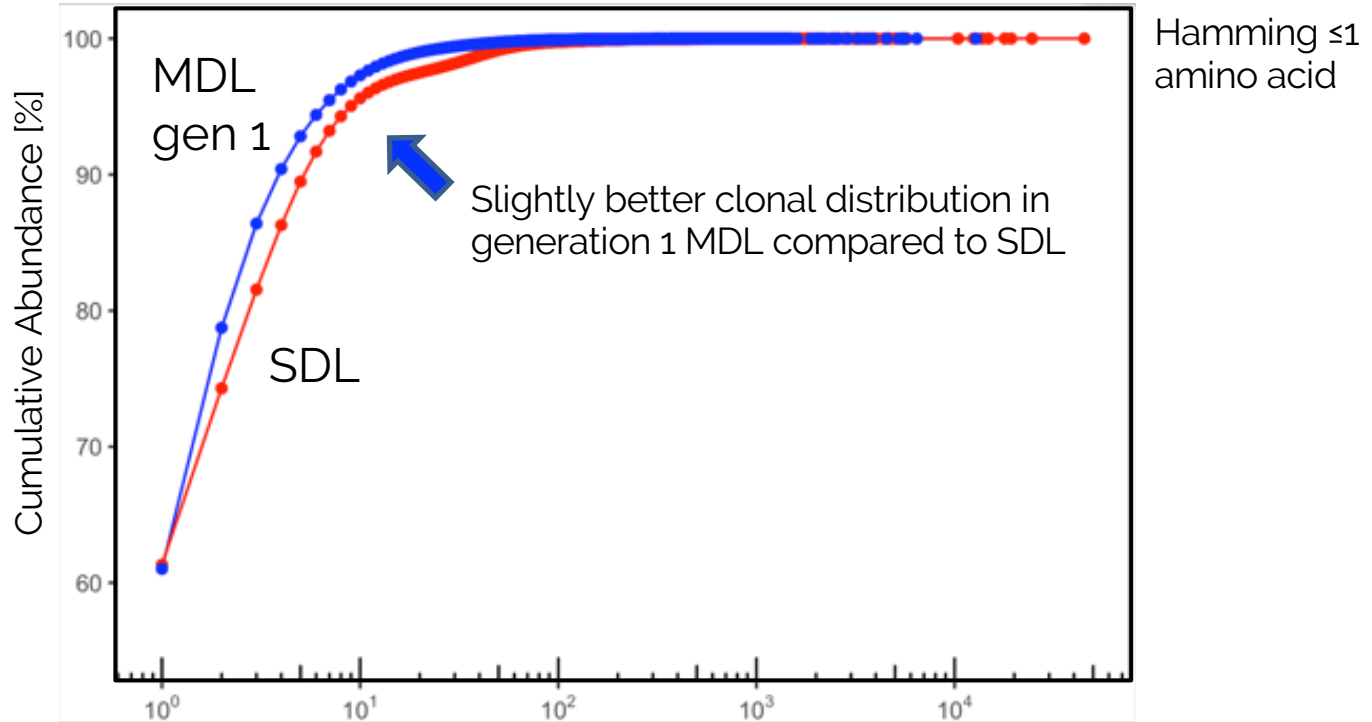
# First Generation Multi-Donor Library



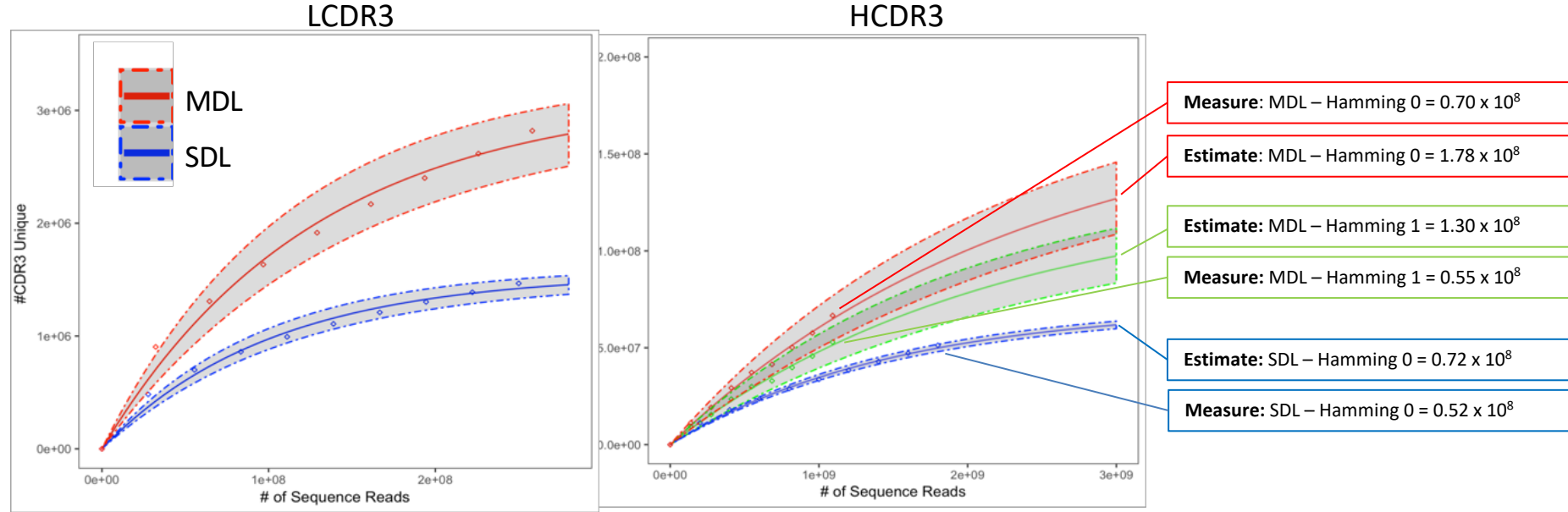
# Single-Donor Library



# Comparison Between First Generation Multi- and Single- Donor Libraries



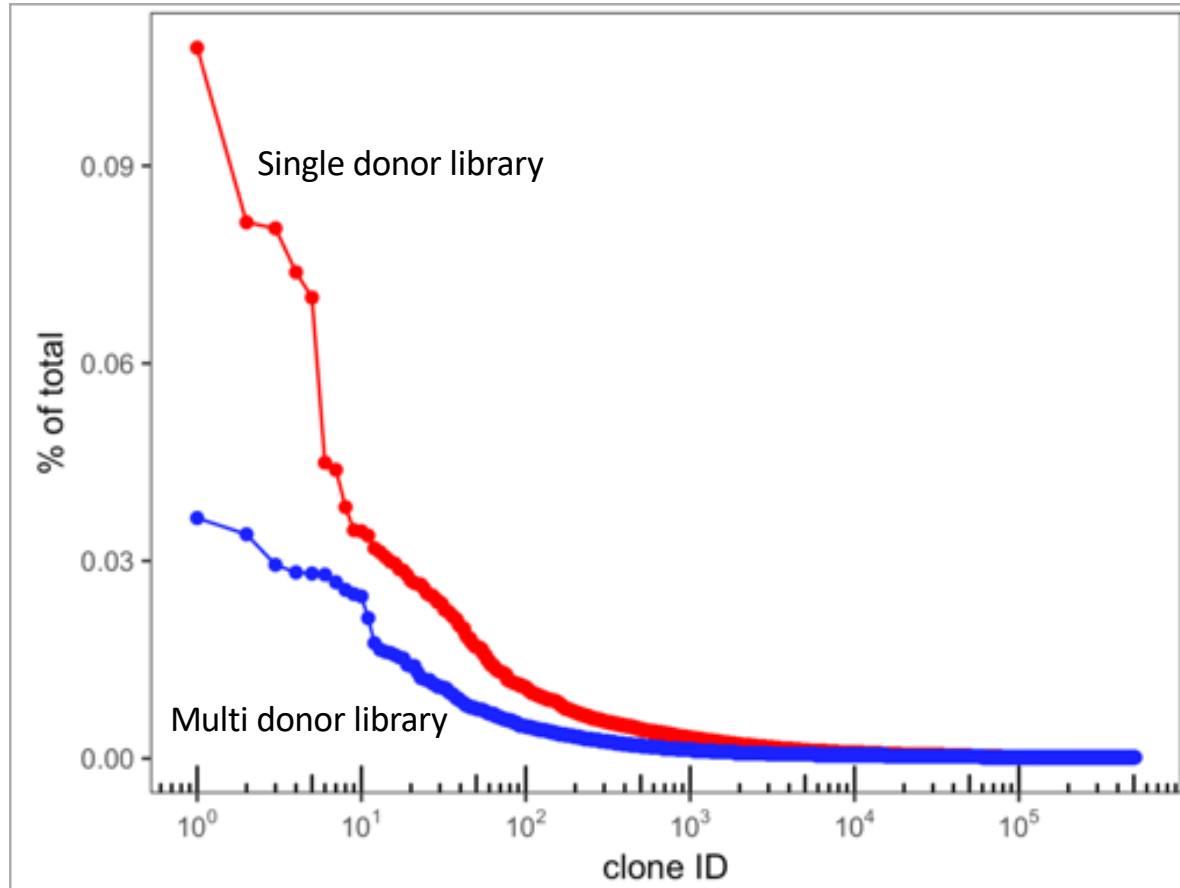
# Analysis of Cloned Diversity (NovaSeq): CDR3 Accumulation Plot



	LCDR3		HCDR3	
Diversity	SDL	MDL	SDL	MDL
Estimate	$1.55 \times 10^6$	$3.63 \times 10^6$	$0.72 \times 10^8$	$1.78 \times 10^8$
Measure	$1.55 \times 10^6$	$3.63 \times 10^6$	$0.52 \times 10^8$	$0.70 \times 10^8$

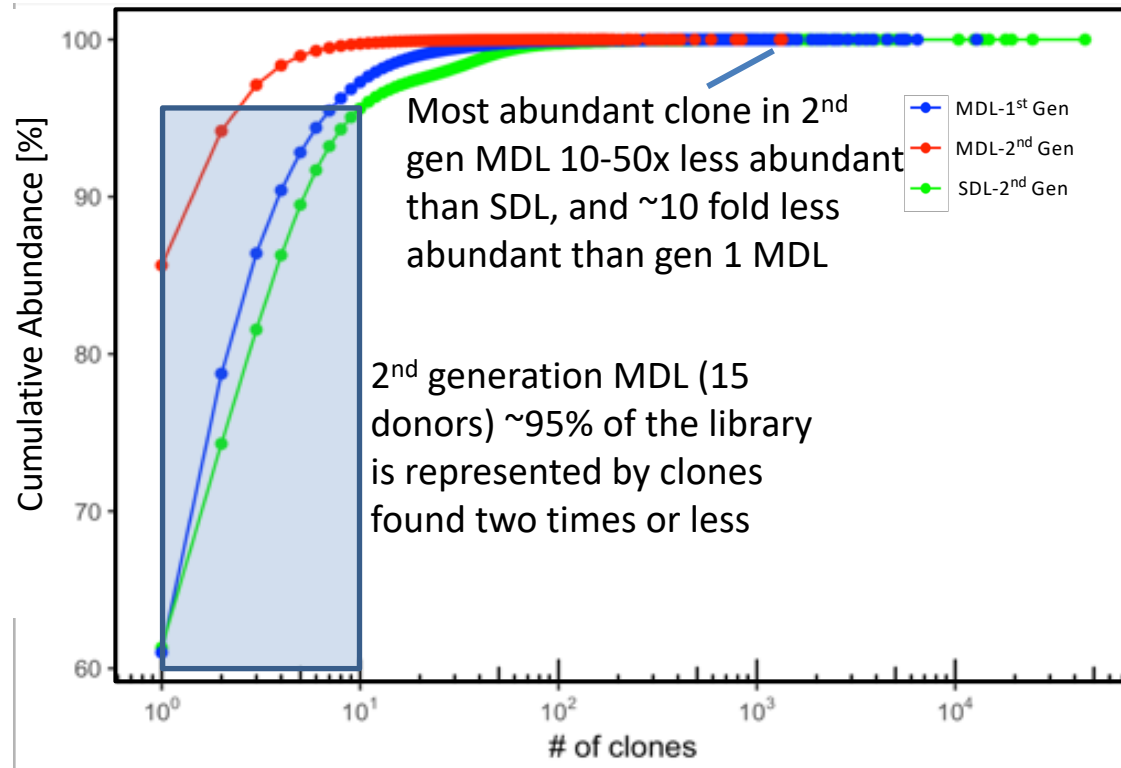
MDL at Hamming 1 shows greater measured and estimated diversity than SDL at Hamming 0 with  $7.0 \times 10^8$  fewer reads

# Reduced Clonal Dominance in Multi Donor Library



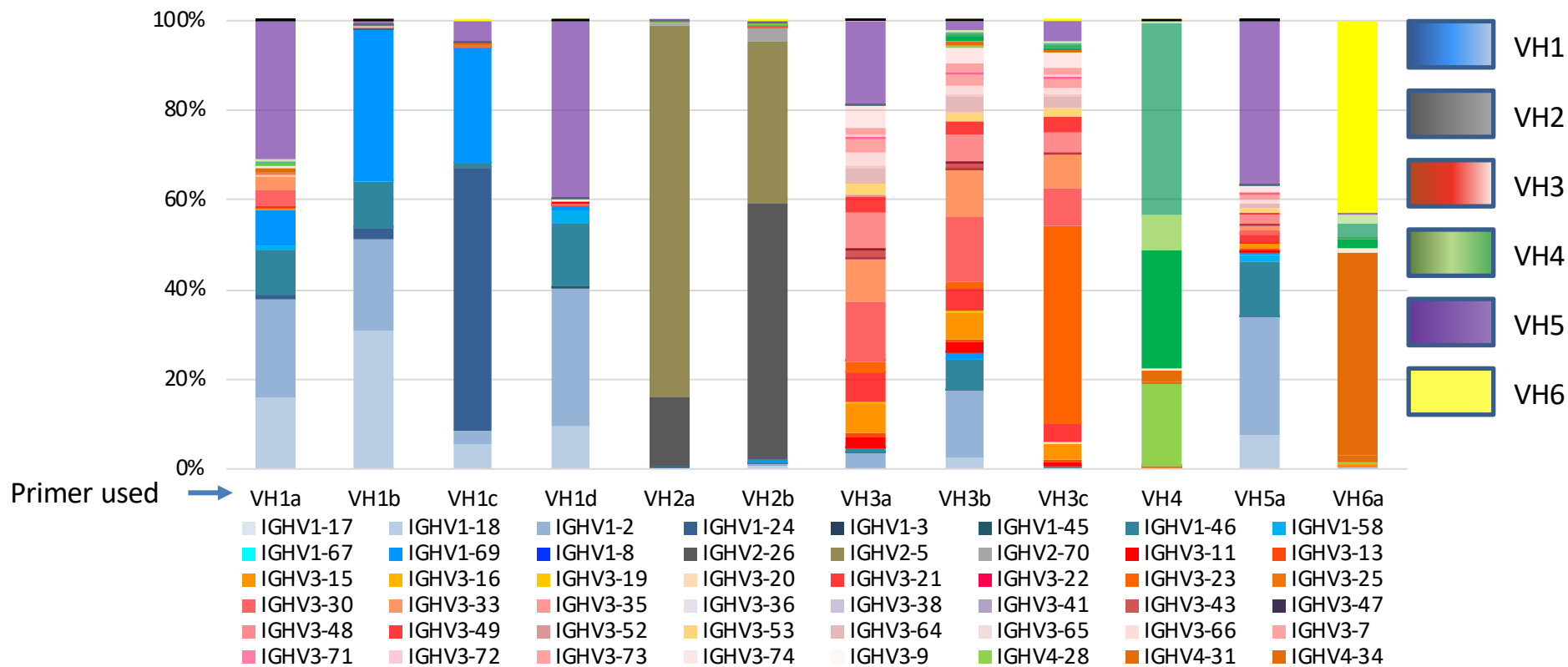


# Normalized comparison of libraries

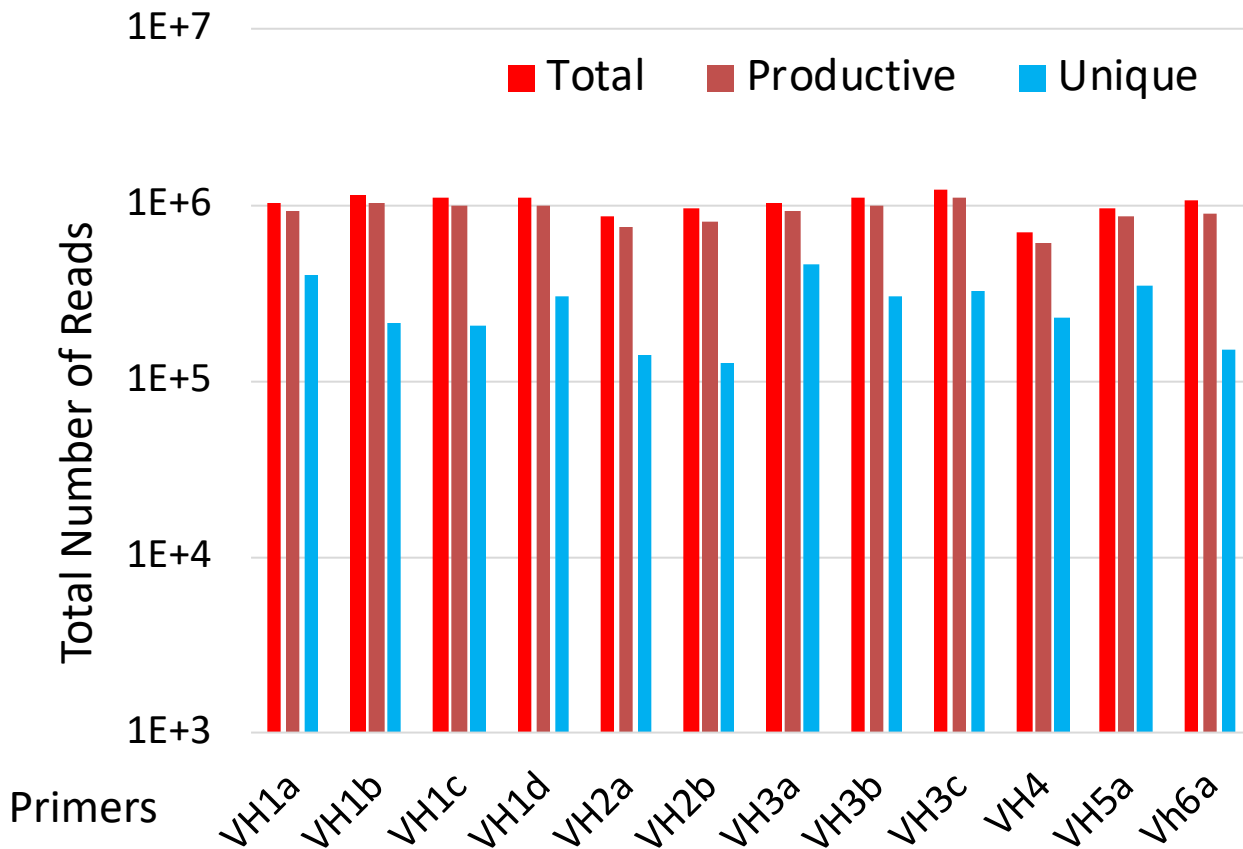


Hamming  $\leq 1$  amino acid

# Amplified VH Gene Family Distribution and Abundance

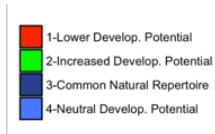
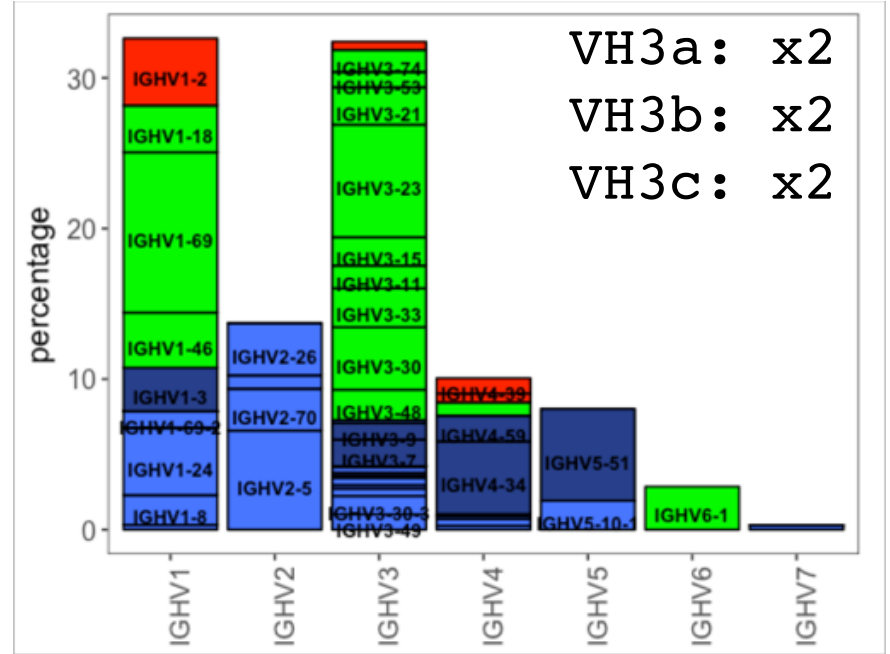
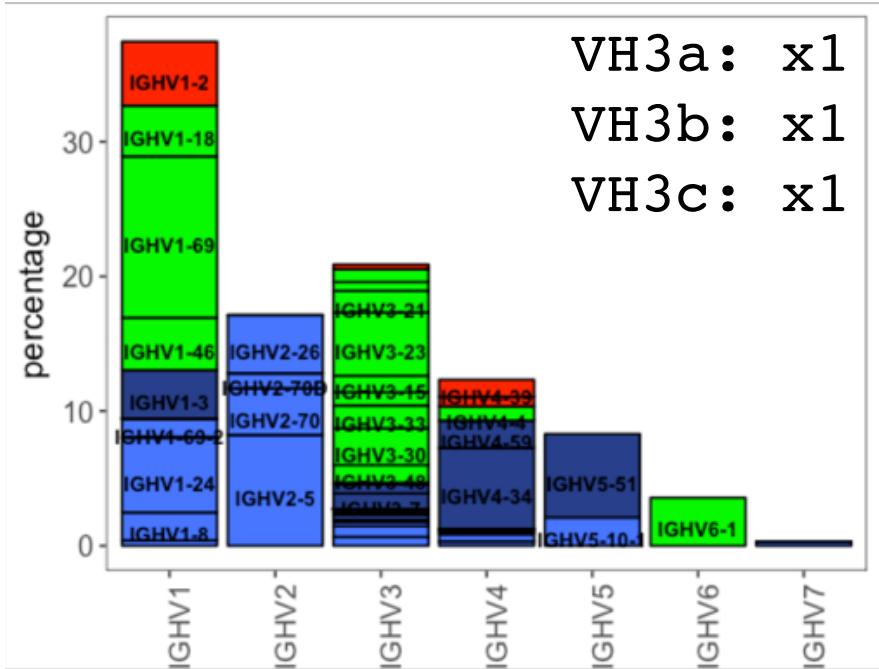


# MiSeq NGS analysis of VH Gene PCR Products



# MiSeq Analysis of MDL1 PCR products: Projected VH Family Distribution

## original distribution



# NGS Analysis for naïve libraries

- NovaSeq provides measure of absolute diversity
  - Greater sequence depth provides better diversity estimates
  - Diversity estimates limited to HCDR3
    - Known to underestimate diversity: HCDR1/2 and VL
- Germline VH and VL gene diversity
  - If carried out at PCR level can adjust final library composition
- Functional diversity (open reading frames)
- VH MDL 2-3 times more diverse than SDL
  - Rate of unique clone accumulation 2-3 times faster
  - Projected final diversity 2-3 times higher
  - Final analysis still to be completed
- MDL shows reduced clonal dominance compared to SDL
  - MDL should perform better if diversity is what counts

Analysis of selections outputs with NGS

# Evolution of in vitro antibody discovery in our laboratory

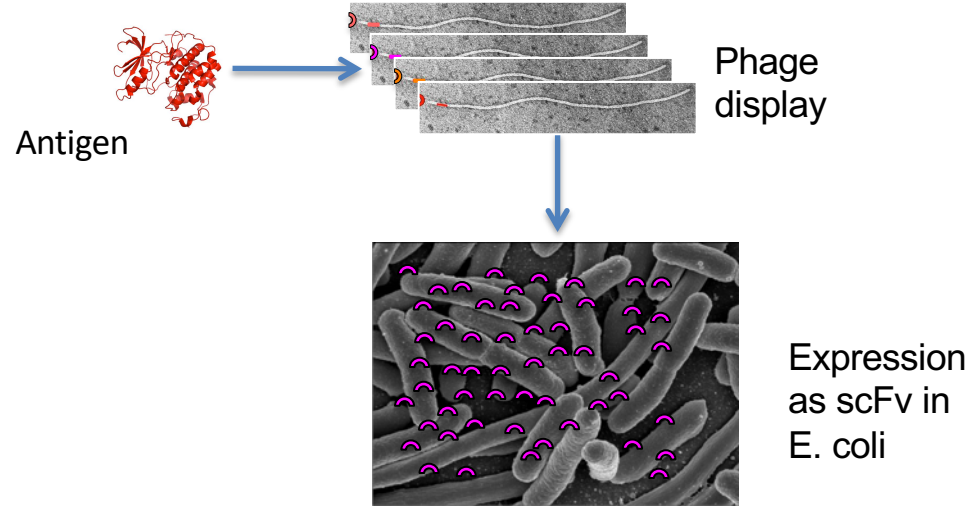
## Display platform

- 1999 Phage display
- 2012 Phage + Yeast
- 2015 Phage + Yeast + NGS

## Number of scFvs

- One to tens selected
  - Tens to hundreds **selected**
  - **Thousands** identified
- 
- **Selected** scFvs are clones available for further study
  - **Identified** scFvs are sequenced identified scFvs that need to be isolated

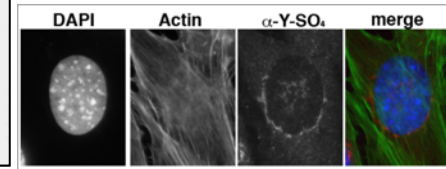
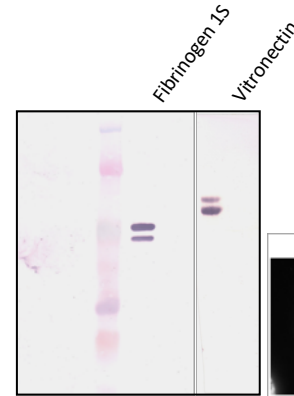
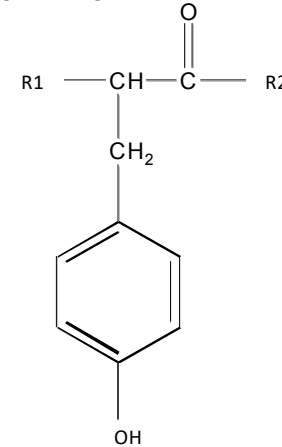
# Selection by phage display





# Selecting antibodies against the tyrosine sulfate modification using phage display

- Tyrosine sulfate found on secreted and membrane proteins
  - Computational analysis suggests up to 33% proteins entering secretory pathway are tyrosine sulfated, but less than 70 shown experimentally
- Numerous attempts to derive specific antibodies by immunization have failed
  - “Impossible antigen” due to expression in secretory pathway
  - Tyrosine sulfate, ubiquitous non-immunogenic modification
- 8000 antibodies screened by phage display
  - One scFv found that recognizes the tyrosine sulfate modification
  - Western blotting, immunofluorescence
  - Affinity  $\sim 1\mu\text{M}$
  - One student, 18 months work
- Reformatted to a mouse IgG
  - Sold by Millipore as a mouse monoclonal!
  - [millipore.com/catalogue/item/05-1100x](http://millipore.com/catalogue/item/05-1100x)



E. coli extract  
Sulfatase  
Marker

Fibrinogen 15  
Vitronectin

DAPI Actin  $\alpha$ -Y-SO<sub>4</sub> merge

Kehoe et al., (2006) Mol. Cell. Proteomics, **5**, 2350-2363

Lassen, K. S. et al., (2008) Electrophoresis **29**, 2557

Ronai, Z. et al. (2009) Biochemical Journal **418**, 155

# Phage vs. Yeast Display

## Phage

- Larger primary libraries
- Selection from naïve libraries
- Relatively straightforward
- Soluble scFv or Fab easily made in *E. coli*
- General familiarity with *E. coli*

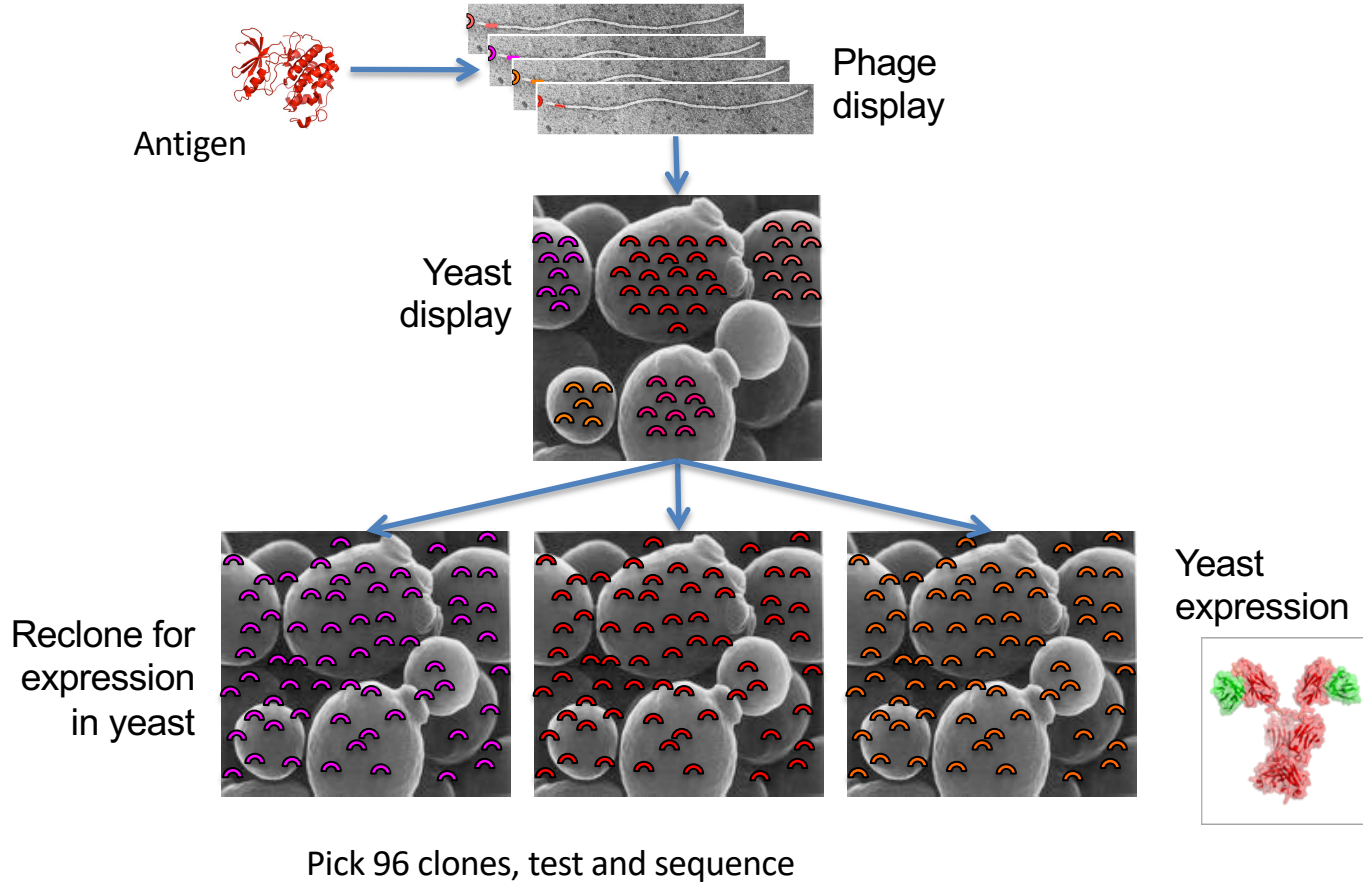
- Selection is a “black box”
- Antibody must be expressed and purified to measure affinity
- Repertoires incompletely sampled

## Yeast

- Smaller primary libraries
  - Libraries  $\leq 10^8$  with gap repair
  - Immune libraries and affinity maturation
- Naive library selections more challenging
- Requires flow cytometry
- Less general familiarity with yeast
- Need to subclone to make native Ab fragment
- Precise selection calibration
- Direct characterization on yeast without antibody purification:
  - Affinity; epitopes
- Repertoires sampled more completely as greater proportion of antibodies displayed\*

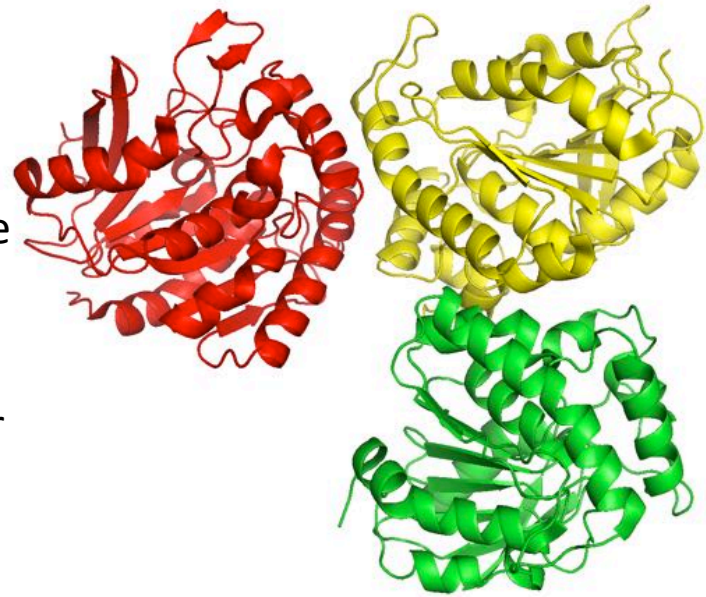


# Combining phage and yeast display to select antibodies



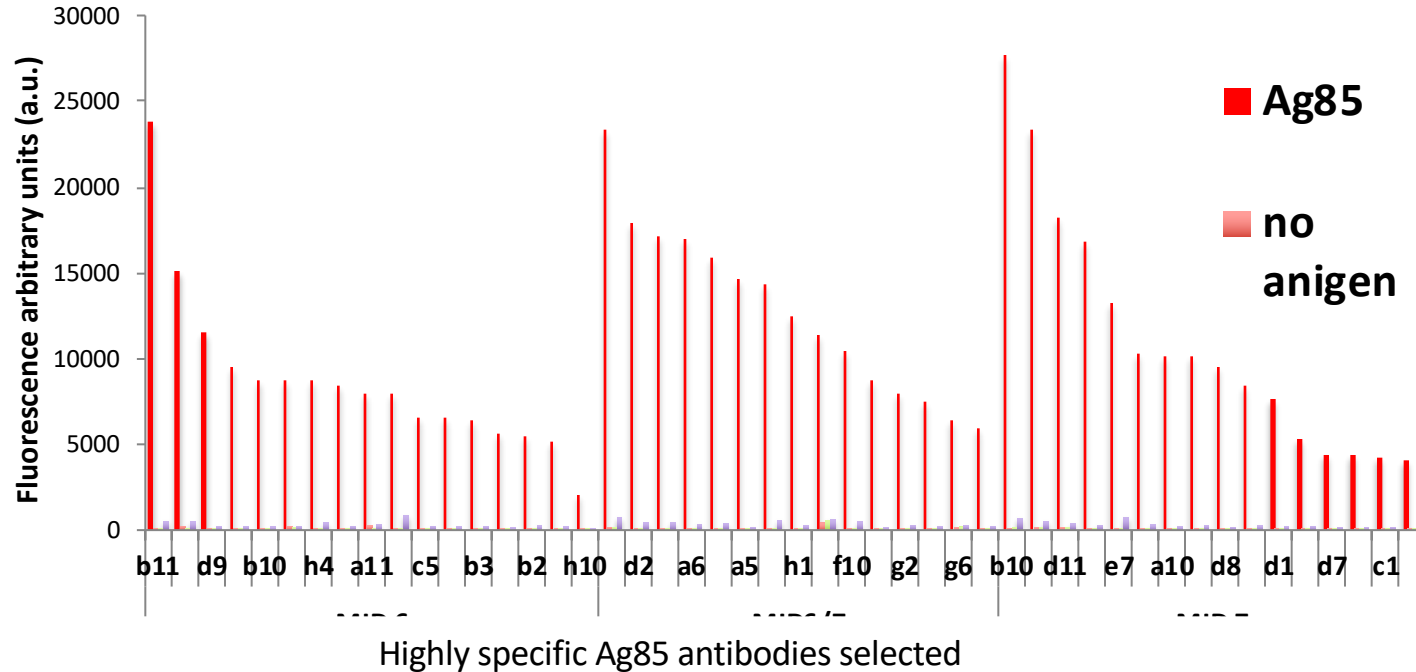
# Ag85 as a *M. tuberculosis* biomarker

- Ag85 is a three protein complex, one of the major secreted protein of *M. tuberculosis*
- Mycolyl transferase involved in cell wall synthesis
- Present in the *sputum* of pulmonary patients, also detected in serum and urine
- Ag85 could be used as a “early” reporter for TB infection assay
- No specific, stable antibodies available for Ag85 detection



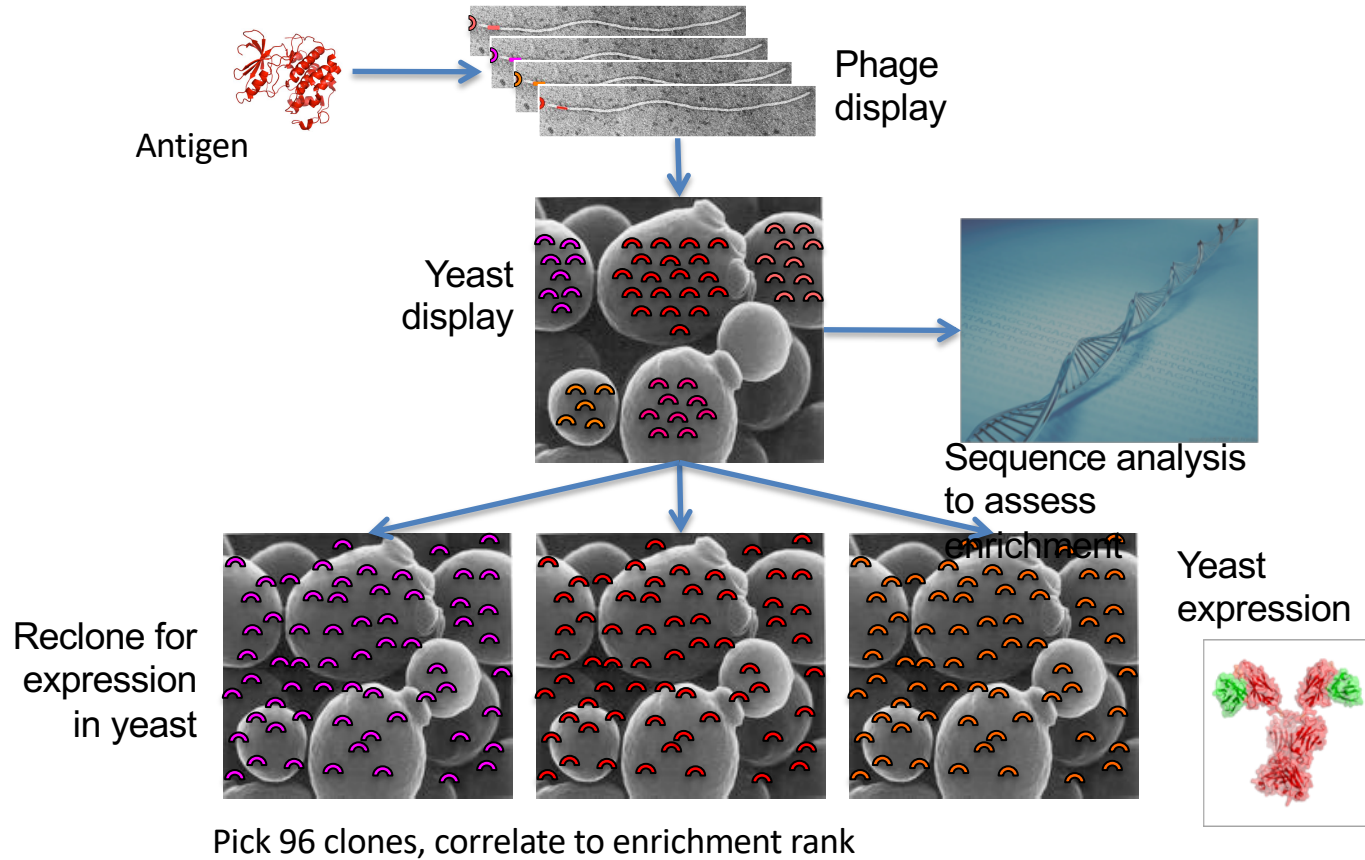
# Selected anti-Ag85 human monoclonals

>111 (of 200 tested) different monoclonals selected  
Kd 20-430 nM

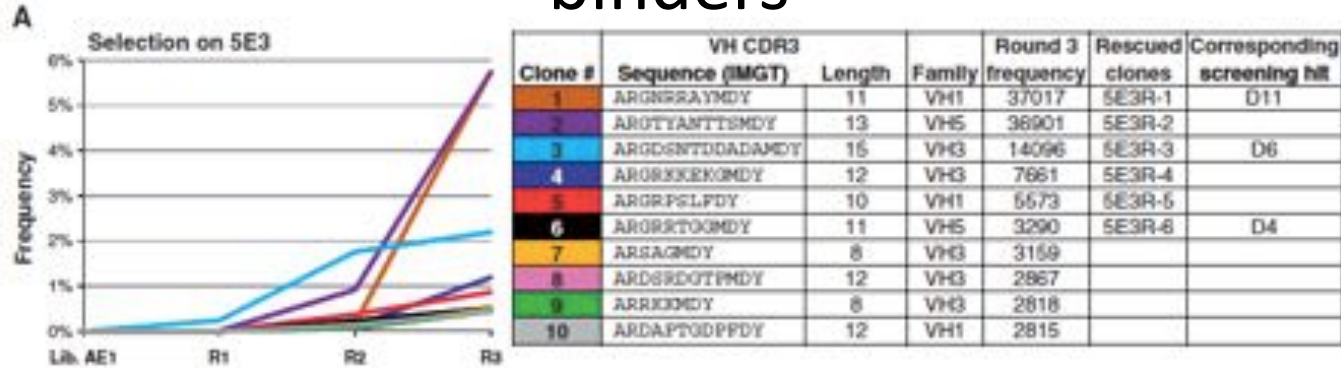


# Adding Next Generation Sequencing

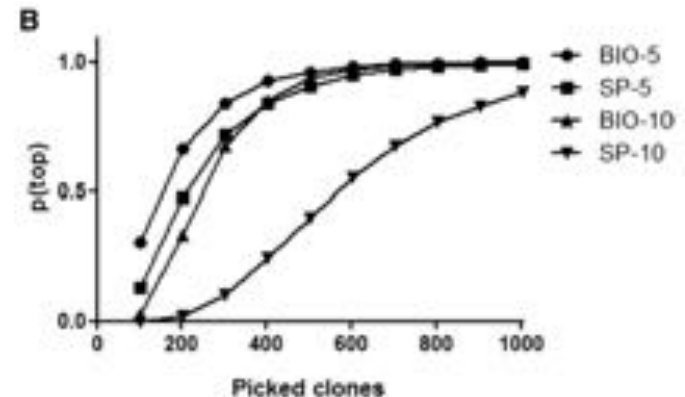
# Integrating NGS into antibody selection screening



# Traditional ELISA screening does **not** isolate all top binders



Ravn *et al.* (2010). *Nucleic Acids Res* 38(21): e193.



Di Niro *et al.*, (2010). *Nucleic Acids Res* 38(9): e110.

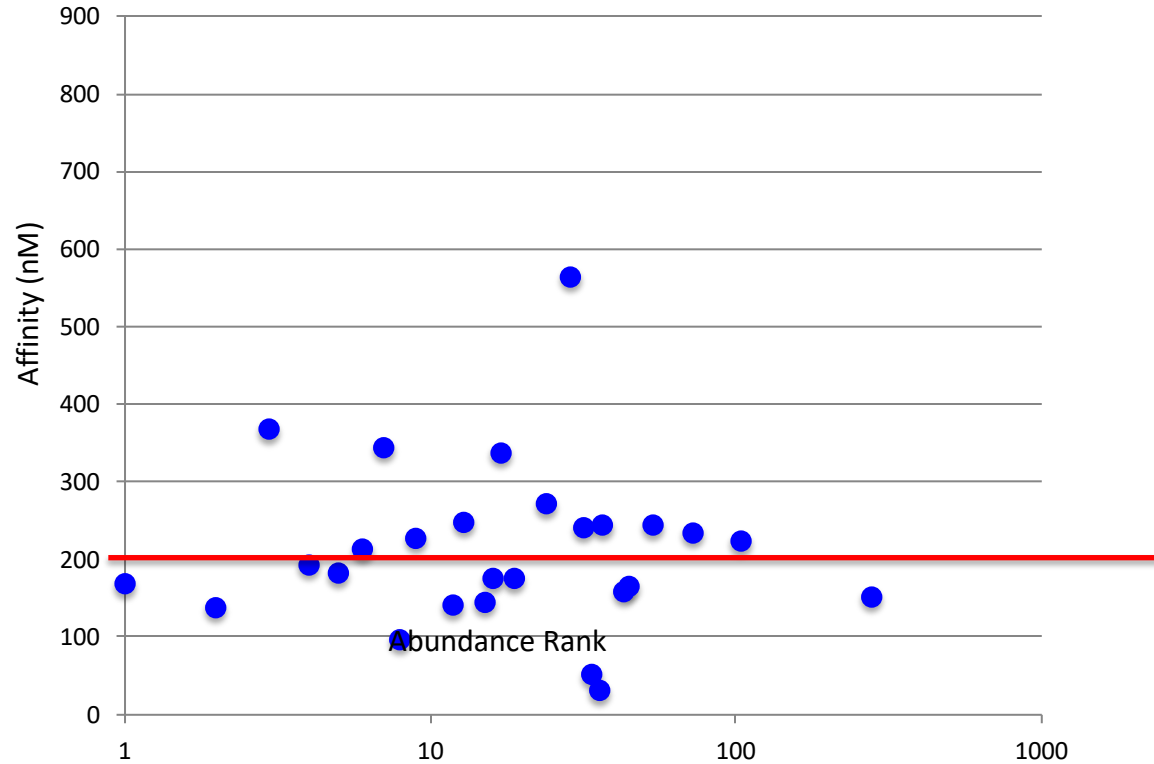


# How Diverse? deep sequencing analysis of selection outputs

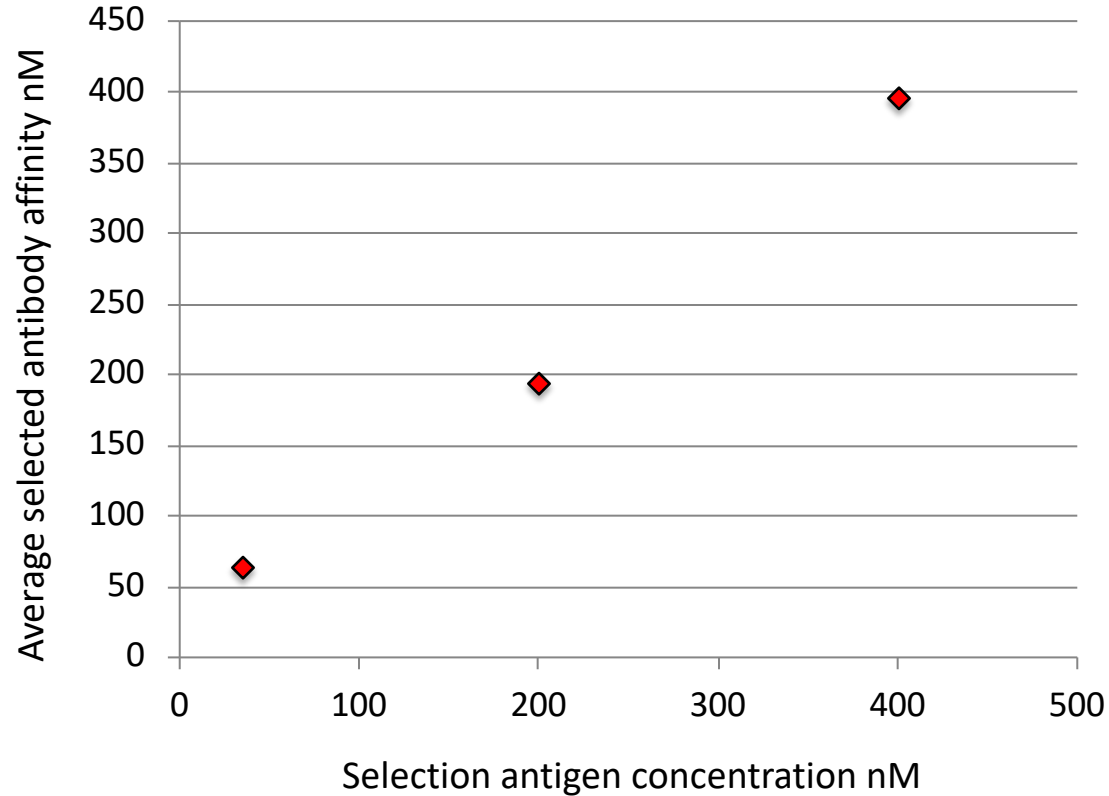
Antigen	Total # sequences	#clusters to 99%
<b>MAP2K5</b>	25342	<b>934</b>
<b>CDK2</b>	32138	<b>880</b>
<b>CTBP2</b>	41608	<b>731</b>
<b>MAPK8</b>	56525	<b>198</b>
<b>PLAA</b>	41996	<b>289</b>
<b>SF3A1</b>	4602	<b>216</b>
<b>USP11</b>	41924	<b>1148</b>
<b>Ubiquitin</b>	33710	<b>175</b>

- 200-1100 different HCDR3s found per target
- Diversity ten fold greater due to different VL and HCDR1/HCDR2's
- Estimated 2,000 to 10,000 different antibodies per target

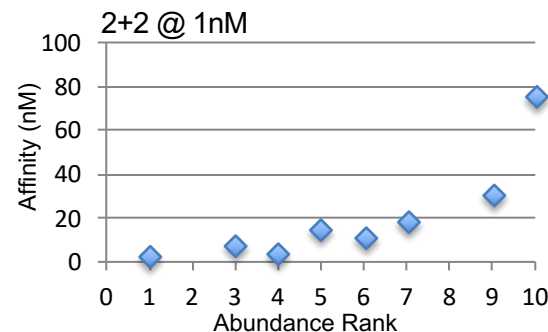
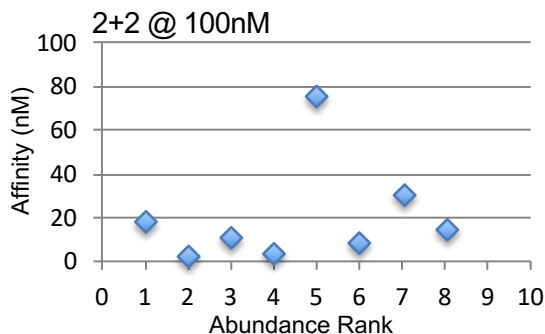
# Affinity of monoclonals selected against ubiquitin



# Improving average polyclonal affinity?



# Correlating affinity with abundance



## HCDR3 sequences

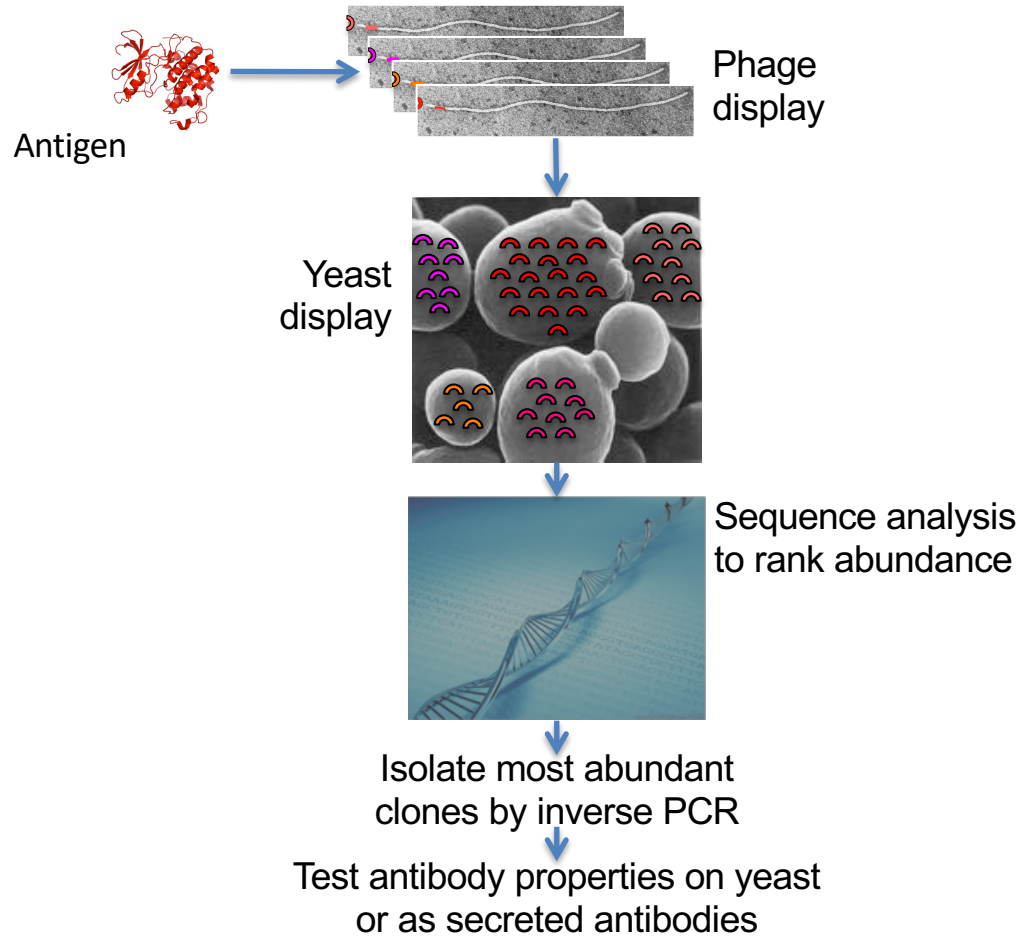
2+2@100nM	%	affinity
CAKGFRAGDAFDIW	18.7	18nM
CASQGFQGDADFIDW	17.5	2 nM
CASHSGNLGTNGVGDAFDIW	10.7	11 nM
CARPYYGSGDAFDYW	8.5	4 nM
CAHSYGDPFDYW	7.6	75 nM
CARPLSGWYGDAFDIW	5.5	8 nM
CARGSSGSFDIW	4.4	30 nM
CATHSSGWYGDAFDIW	2.6	15 nM
CARVSAFGETFDLW	2.3	
CARADWIDAFDIW	2.2	
	80.2	

2+2@1nM	%	affinity
CASQGFQGDADFIDW	37.7	2 nM
CARGTEGWFDPW	15.9	
CARPLSGWYGDAFDIW	14.7	8 nM
CARPYYGSGDAFDYW	6.1	4 nM
CATHSSGWYGDAFDIW	2.8	15 nM
CASHSGNLGTNGVGDAFDIW	2.5	11 nM
CAKGFRAGDAFDIW	2.3	18 nM
CARDLGSDYYDSSGYPGGDAFDIW	1.9	
CARGSSGSFDIW	1.4	30 nM
CAHSYGDPFDYW	1.2	75 nM
	86.5	

# Are we accessing the full diversity of our libraries?

- Phage selection on CDK2
  - 8 different scFvs identified
  - Affinities, 30-83 nM
- Phage and yeast display
  - 27 different scFvs
  - Affinities 32-565 nM
- Phage, yeast and deep sequencing
  - There may be some mutations and recombination going from phage to yeast
  - 880 different HCDR3s identified
  - All antibodies tested, down to 277<sup>th</sup> in abundance, bind target
  - Affinities, 2-565 nM
    - Improved affinities with selections on reduced target concentrations
- Full library diversity not accessed by standard selections

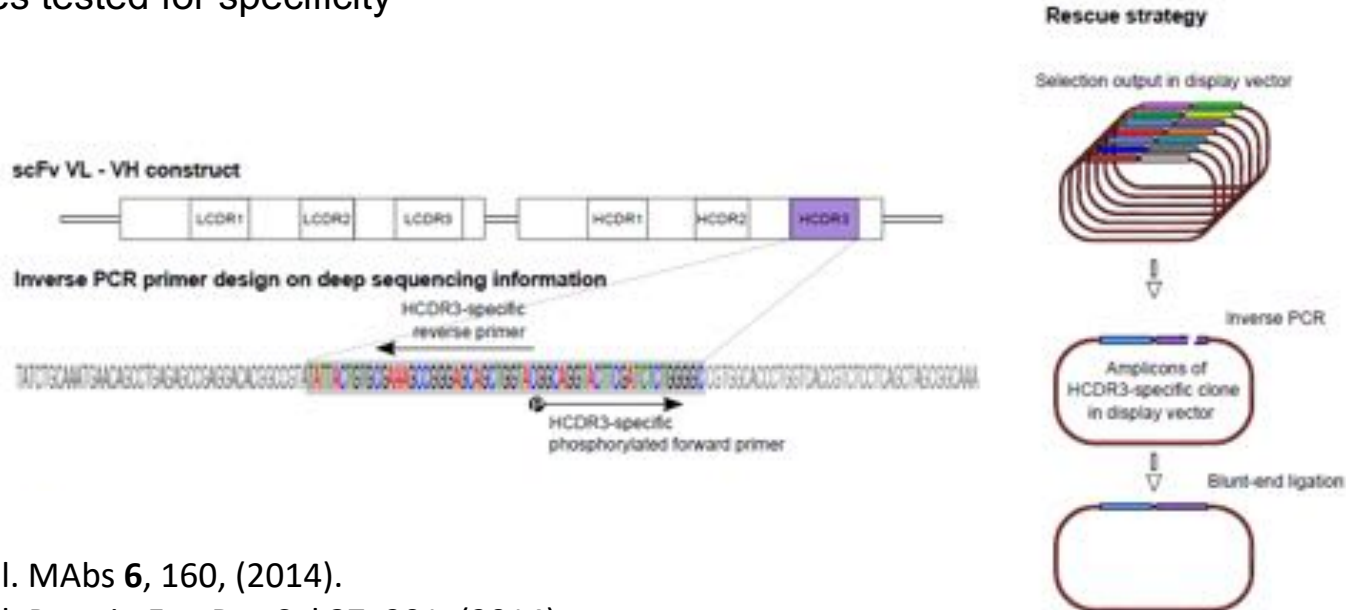
# Using NGS to directly isolate most abundant antibodies



# From sequences to clones

- HCDR3 specific primers designed from DNA sequence
- Inverse PCR performed on selected output and ligated
- Single clones with same HCDR3 obtained
- Clones tested for specificity

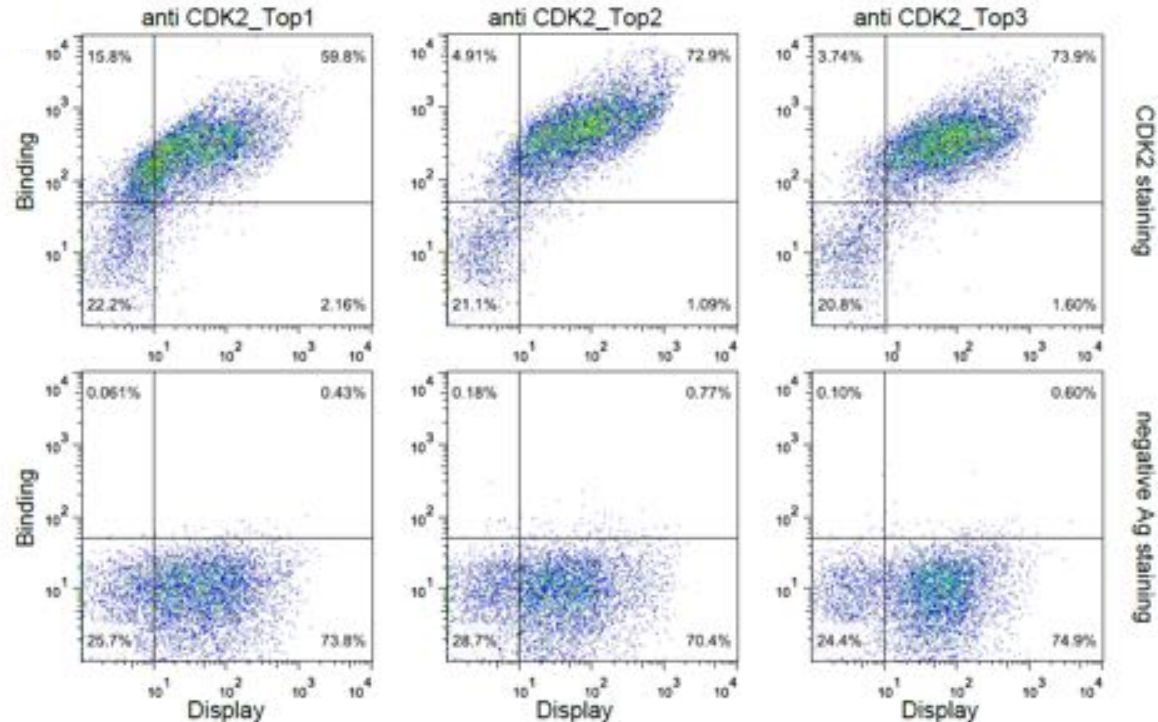
antiCDK2 top ranking	%
CAKGFRAGDAFDIW	18.7
CASQGFQGDADFIDW	17.5
CASHSGNLGTNGVGDAFDIW	10.7
CARPYYGSGDAFDYW	8.5
CAHSYGDPFDYW	7.6
CARPLSGWYGDAFDIW	5.5
CARGSSGSFDIW	4.4
CATHSSGWYGDAFDIW	2.6
CARVSAFGETFDLW	2.3
CARADWIDAFDIW	2.2
	80.2



D'Angelo, S. et al. MAbs **6**, 160, (2014).

D'Angelo, S. et al. Protein Eng Des Sel **27**, 301, (2014).

# Inverse PCR applied to 3 most abundant clones in anti-CDK2 selections

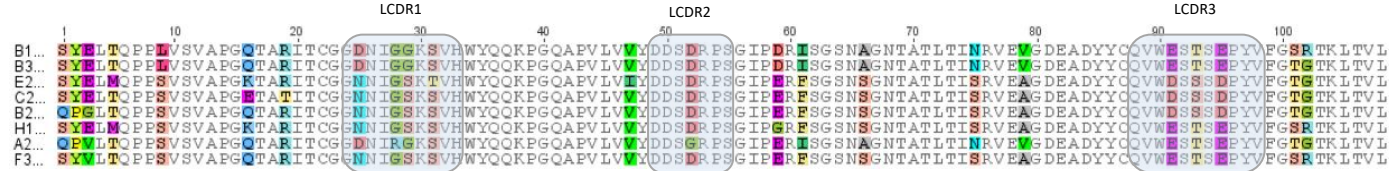


- We can successfully design HCDR3 specific primers to rescue full-length scFvs from selected polyclonal pools
- Top ranking clones are binders

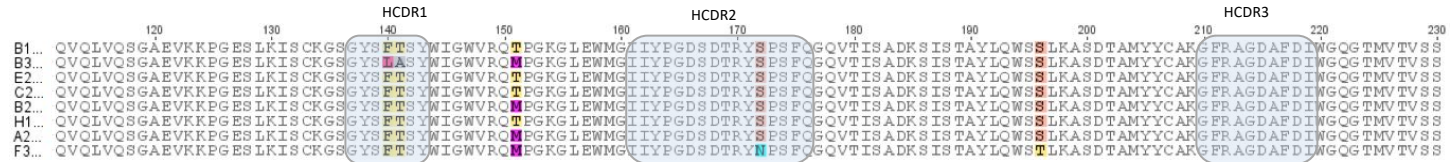


# Dissecting the monoclonality

## VL domain

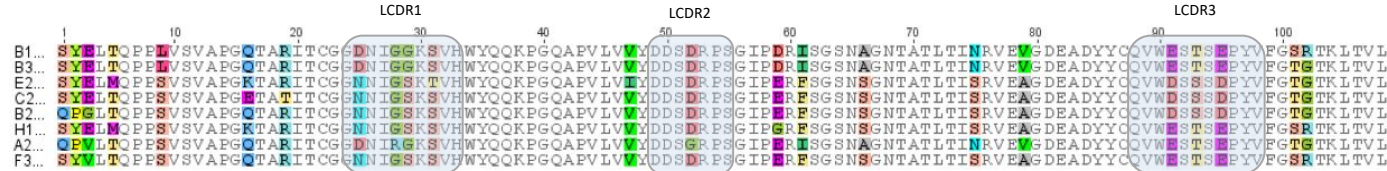


## VH domain

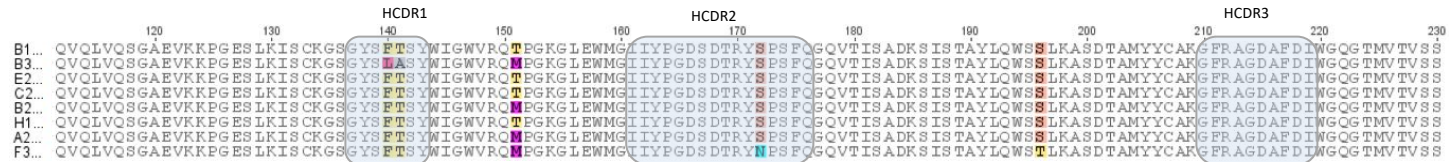


# Dissecting the monoclonality

## VL domain



## VH domain

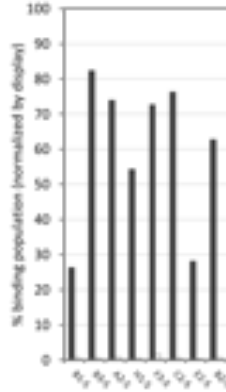


	Kd
B1_1	30.1
B3_1	61.6
E2_2	64.5
C2_1	84.4
B2_2	135.8
H1_1	173.6
A2_2	203.9
F3_1	352.5

- Antibodies with same HCDR3 show a **30-350 nM** range of affinities
- Polyclonality is extended to the antibodies sharing the same HCDR3
  - Antibodies <98% homology considered different
  - Selected Abs 91.6 – 97.8% homologous
- Pairing with different VL domains and additional VH mutation leads to a suite of antibodies recognizing the same epitope with a wide affinity range

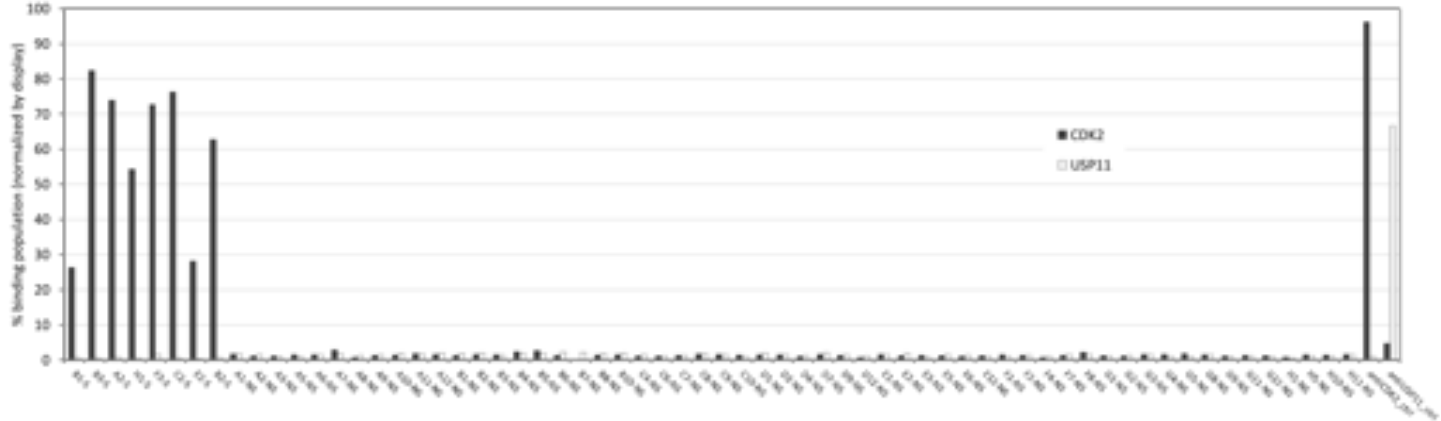
# What about in the naïve unselected library?

## Binding data for clones with identical HCDR3s



Selected binding  
clones

What about in the naïve unselected library?  
Binding data for clones with identical HCDR3s

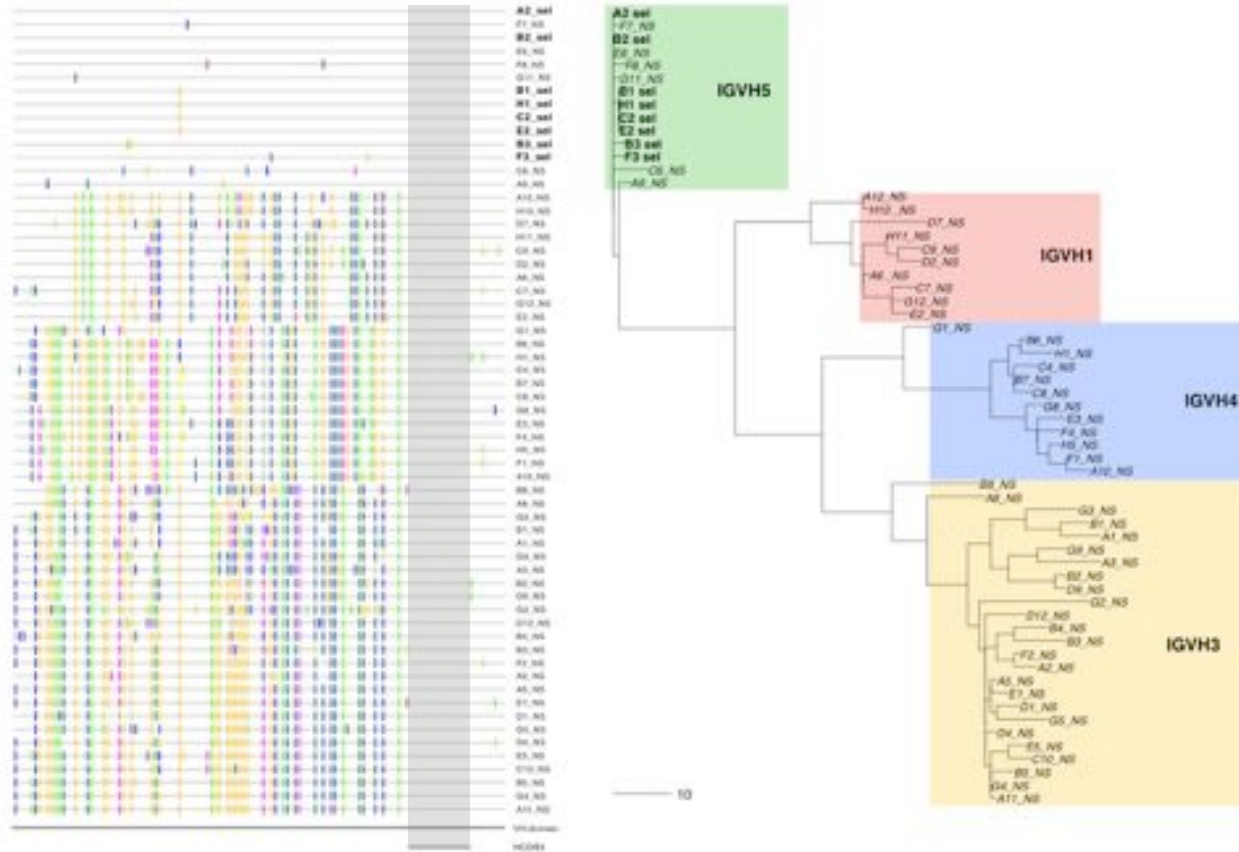


## Selected binding clones

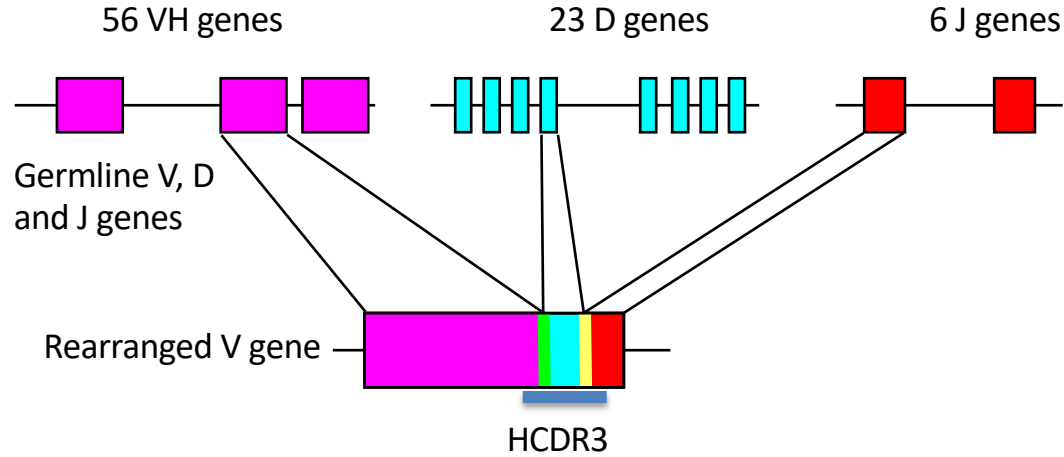
### Unselected clones with same HCDR3

- HCDR3 is necessary but not sufficient for binding
- Clones with the same HCDR3 but different VL do not bind to antigen

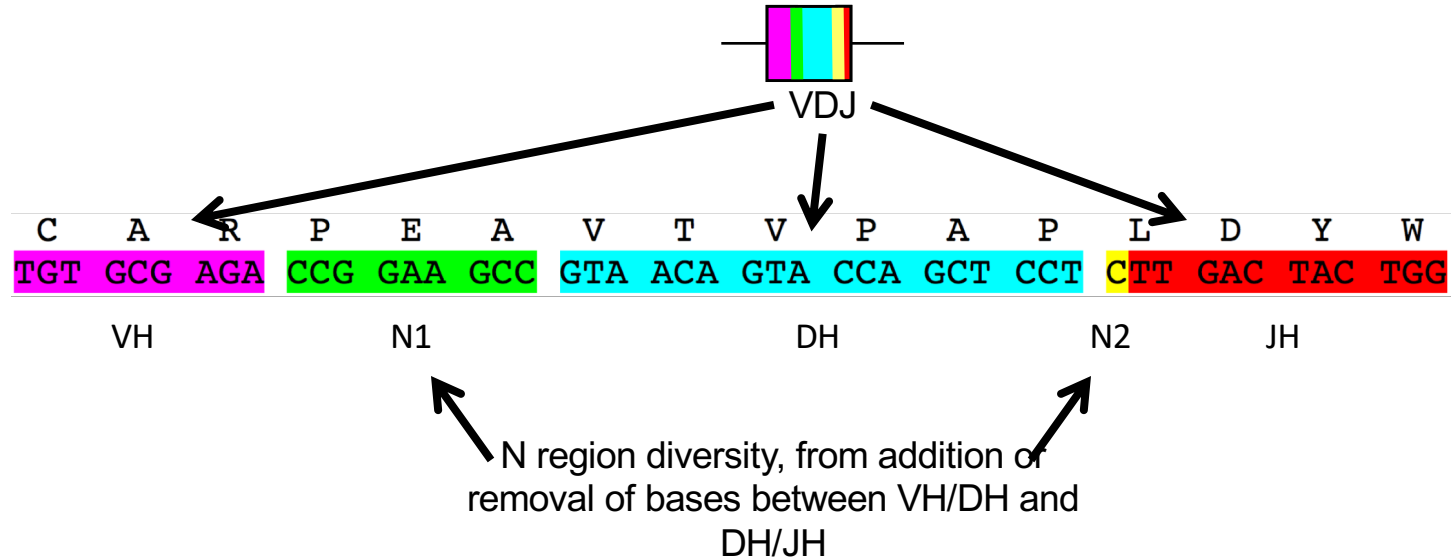
# Diversity of VHs with the same HCDR3



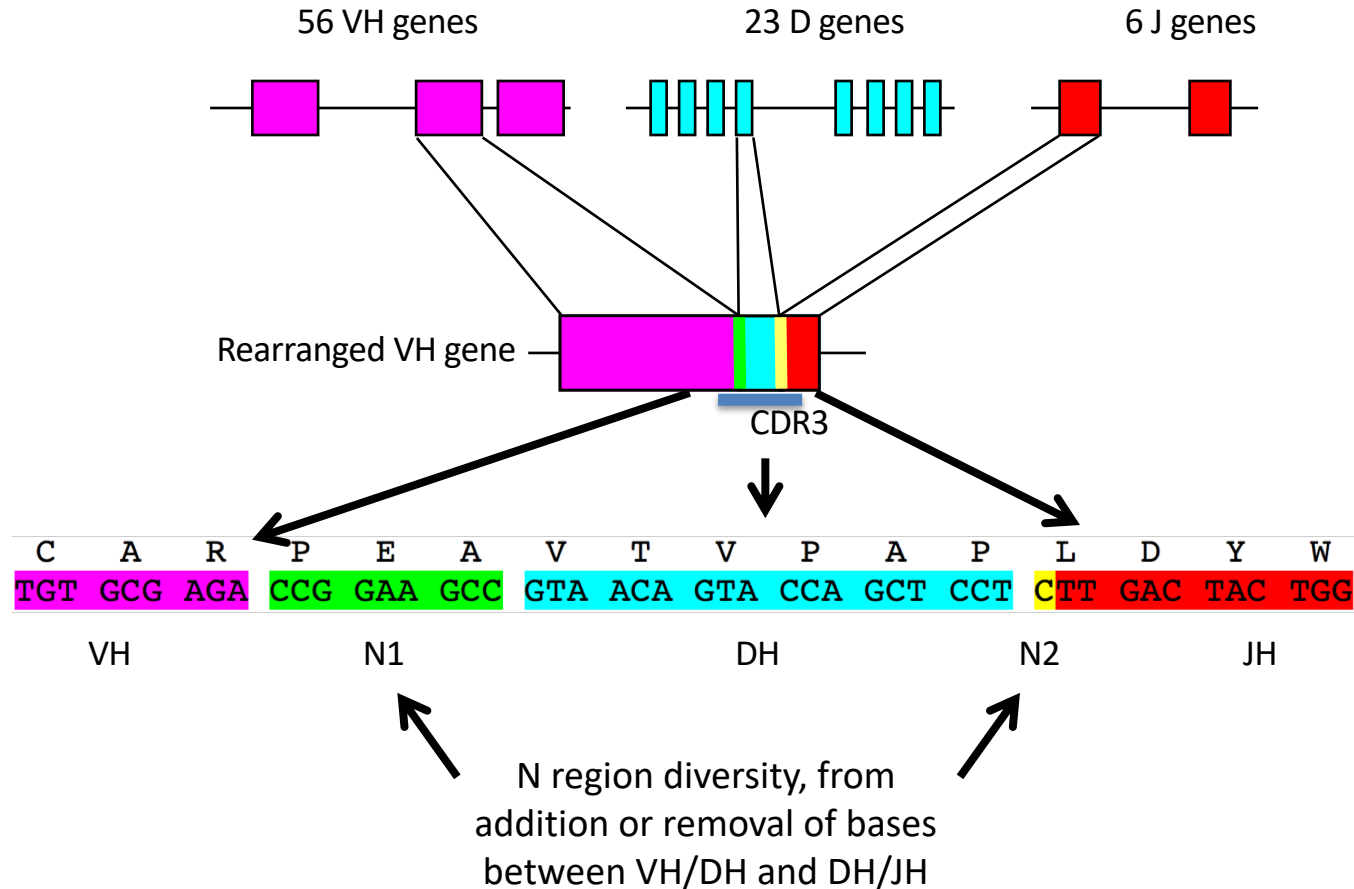
# How VH genes are made in vivo



# Detailed examination HCDR3 origins

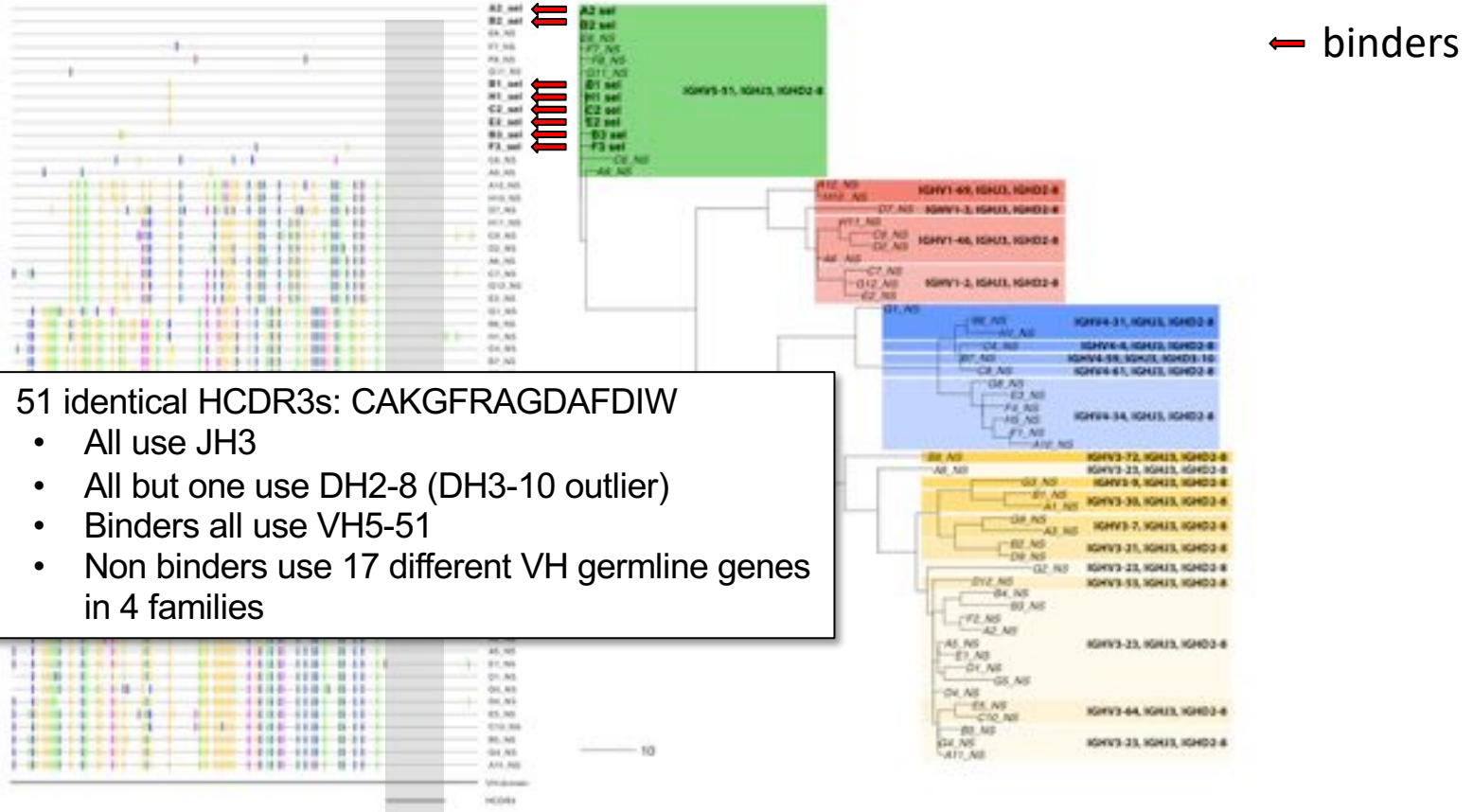


# How VH genes are made in vivo





# Germline gene origins



# What happens in vivo?

- Two in vivo generated NGS datasets
  - DeKosky – ~55,000 HCDR3 sequences from naïve B cells of 3 subjects
    - 23 pairs of identical HCDR3s shared between 2 subjects (0.08% all reads)
      - All discordant for VH, 7 discordant for DH, identical JH
    - No identical HCDR3s in all 3 subjects
  - DeWitt – total 37M HCDR3 sequences from naïve B cells of single subject
    - 8,596,145 productive MiSeq reads comprising 7,984,053 unique HCDR3s from naïve B cells of three donors
      - 568 identical HCDR3s (0.007% of the total unique HCDR3s) generated by different VDJ recombinations
        - » Generated with 2-26 different VDJ rearrangements
        - » 176 rearrangements found in all three donors.

DeKosky, B. J. *et al. Proc Natl Acad Sci U S A* **113**, E2636, (2016).

DeWitt, W. S. *et al. PLoS One* **11**, e0160853, (2016).

HCDR3 aa Sequence	# rearrangements	VH family	VH gene	DH gene	JH gene	Donor Representation
CARDRGDYW	26	IGHV01	IGHV01-02	IGHD03-10	IGHJ04-01	donor1
CARDRGDYW	26	IGHV01	IGHV01-02	IGHD05-24	IGHJ04-01	donor3
CARDRGDYW	26	IGHV01	IGHV01-03	IGHD01-26	IGHJ04-01	donor3
CARDRGDYW	26	IGHV01	IGHV01-03	IGHD03-10	IGHJ04-01	donor3
CARDRGDYW	26	IGHV01	IGHV01-03	IGHD06-25	IGHJ04-01	donor1
CARDRGDYW	26	IGHV01	IGHV01-18	IGHD03-10	IGHJ04-01	donor3
CARDRGDYW	26	IGHV01	IGHV01-18	IGHD03-16	IGHJ04-01	donor1, donor3
CARDRGDYW	26	IGHV01	IGHV01-18	IGHD05-24	IGHJ04-01	donor2
CARDRGDYW	26	IGHV01	IGHV01-18	IGHD06-25	IGHJ04-01	donor3
CARDRGDYW	26	IGHV01	IGHV01-46	IGHD03-10	IGHJ04-01	donor1, donor2, donor3
CARDRGDYW	26	IGHV01	IGHV01-46	IGHD03-16	IGHJ04-01	donor2
CARDRGDYW	26	IGHV01	IGHV01-69	IGHD03-10	IGHJ04-01	donor1, donor2, donor3
CARDRGDYW	26	IGHV01	IGHV01-69	IGHD03-16	IGHJ04-01	donor2
CARDRGDYW	26	IGHV03	IGHV03-11	IGHD03-10	IGHJ04-01	donor1
CARDRGDYW	26	IGHV03	IGHV03-11	IGHD03-16	IGHJ04-01	donor1
CARDRGDYW	26	IGHV03	IGHV03-13	IGHD03-10	IGHJ04-01	donor1
CARDRGDYW	26	IGHV03	IGHV03-48	IGHD03-10	IGHJ04-01	donor3
CARDRGDYW	26	IGHV03	IGHV03-53	IGHD03-10	IGHJ04-01	donor1, donor3
CARDRGDYW	26	IGHV03	IGHV03-53	IGHD03-16	IGHJ04-01	donor3
CARDRGDYW	26	IGHV03	IGHV03-53	IGHD05-24	IGHJ04-01	donor1
CARDRGDYW	26	IGHV03	IGHV03-64	IGHD03-10	IGHJ04-01	donor1, donor3
CARDRGDYW	26	IGHV03	IGHV03-66	IGHD03-10	IGHJ04-01	donor2, donor3
CARDRGDYW	26	IGHV04	IGHV04-39	IGHD03-10	IGHJ04-01	donor1, donor3
CARDRGDYW	26	IGHV04	IGHV04-39	IGHD03-16	IGHJ04-01	donor3
CARDRGDYW	26	IGHV05	IGHV05-51	IGHD03-16	IGHJ04-01	donor2
CARDRGDYW	26	IGHV07	IGHV07-04_1	IGHD03-10	IGHJ04-01	donor3
CARDSSGWYYFDYW	20	IGHV01	IGHV01-02	IGHD06-19	IGHJ04-01	donor1, donor2, donor3
CARDSSGWYYFDYW	20	IGHV01	IGHV01-03	IGHD06-19	IGHJ04-01	donor1, donor2, donor3
CARDSSGWYYFDYW	20	IGHV01	IGHV01-08	IGHD06-19	IGHJ04-01	donor1
CARDSSGWYYFDYW	20	IGHV01	IGHV01-18	IGHD06-19	IGHJ04-01	donor1, donor2, donor3
CARDSSGWYYFDYW	20	IGHV01	IGHV01-46	IGHD06-19	IGHJ04-01	donor1, donor3
CARDSSGWYYFDYW	20	IGHV01	IGHV01-69	IGHD06-19	IGHJ04-01	donor2, donor3
CARDSSGWYYFDYW	20	IGHV02	IGHV02-70	IGHD06-19	IGHJ04-01	donor1, donor3
CARDSSGWYYFDYW	20	IGHV03	IGHV03-11	IGHD06-19	IGHJ04-01	donor1
CARDSSGWYYFDYW	20	IGHV03	IGHV03-20	IGHD06-19	IGHJ04-01	donor1
CARDSSGWYYFDYW	20	IGHV03	IGHV03-23	IGHD06-19	IGHJ04-01	donor3
CARDSSGWYYFDYW	20	IGHV03	IGHV03-48	IGHD06-19	IGHJ04-01	donor3
CARDSSGWYYFDYW	20	IGHV03	IGHV03-53	IGHD06-19	IGHJ04-01	donor1, donor2, donor3
CARDSSGWYYFDYW	20	IGHV03	IGHV03-64	IGHD06-19	IGHJ04-01	donor3
CARDSSGWYYFDYW	20	IGHV03	IGHV03-66	IGHD06-19	IGHJ04-01	donor2, donor3
CARDSSGWYYFDYW	20	IGHV03	IGHV03-72	IGHD06-19	IGHJ04-01	donor3
CARDSSGWYYFDYW	20	IGHV03	IGHV03-74	IGHD06-19	IGHJ04-01	donor1, donor2
CARDSSGWYYFDYW	20	IGHV04	IGHV04-39	IGHD06-19	IGHJ04-01	donor3
CARDSSGWYYFDYW	20	IGHV05	IGHV05-51	IGHD06-19	IGHJ04-01	donor3
CARDSSGWYYFDYW	20	IGHV06	IGHV06-01	IGHD06-19	IGHJ04-01	donor1, donor2
CARDSSGWYYFDYW	20	IGHV07	IGHV07-04_1	IGHD06-19	IGHJ04-01	donor3

Two examples of HCDR3s derived from multiple rearrangements

- 14 different VH germlines from 5 different VH families
- 5 DH genes
- 1 JH

- 20 different VH germlines from all VH families
- 1 DH gene
- 1 JH

# Examples of HCDR3s with identical rearrangements found in 3 donors

HCDR3	VH gene	DH gene	JH gene	number
CARDSSGWYYFDYW	IGHV01-02	IGHD06-19	IGHJ04-01	4
CARDSSGWYYFDYW	IGHV01-03	IGHD06-19	IGHJ04-01	4
CARDSSGWYYFDYW	IGHV01-18	IGHD06-19	IGHJ04-01	4
CARDSSGWYYFDYW	IGHV03-53	IGHD06-19	IGHJ04-01	4
CARGYSSGWYYFDYW	IGHV01-02	IGHD06-19	IGHJ04-01	4
CARGYSSGWYYFDYW	IGHV01-46	IGHD06-19	IGHJ04-01	4
CARGYSSGWYYFDYW	IGHV03-53	IGHD06-19	IGHJ04-01	4
CARGYSSGWYYFDYW	IGHV05-51	IGHD06-19	IGHJ04-01	4
CARGYSSSWYYFDYW	IGHV01-18	IGHD06-13	IGHJ04-01	3
CARGYSSSWYYFDYW	IGHV01-69	IGHD06-13	IGHJ04-01	3
CARGYSSSWYYFDYW	IGHV05-51	IGHD06-13	IGHJ04-01	3
CAKDSGSYYFDYW	IGHV03-23	IGHD01-26	IGHJ04-01	2
CAKDSGSYYFDYW	IGHV03-43	IGHD01-26	IGHJ04-01	2
CARDCSSTSCYDYW	IGHV01-02	IGHD02-02	IGHJ04-01	2
CARDCSSTSCYDYW	IGHV01-18	IGHD02-02	IGHJ04-01	2
CARDRGDYW	IGHV01-46	IGHD03-10	IGHJ04-01	2
CARDRGDYW	IGHV01-69	IGHD03-10	IGHJ04-01	2
CARDRGWFDPW	IGHV01-18	IGHD03-10	IGHJ05-01	2
CARDRGWFDPW	IGHV03-74	IGHD03-10	IGHJ05-01	2
CARDRGYSGYDFDYW	IGHV01-02	IGHD05-12	IGHJ04-01	2
CARDRGYSGYDFDYW	IGHV01-18	IGHD05-12	IGHJ04-01	2

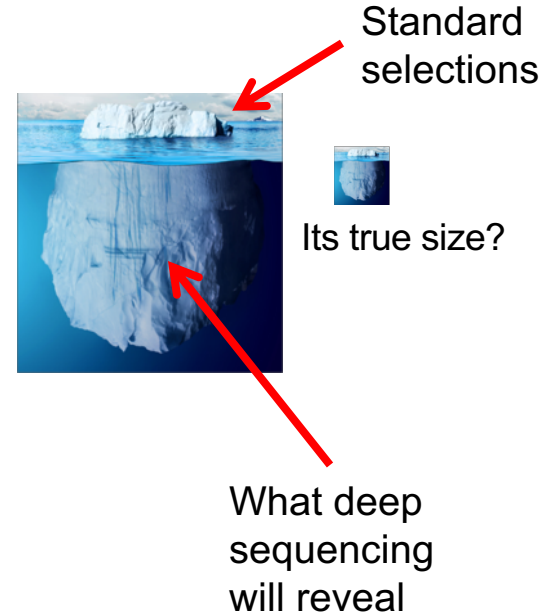
# Conclusion

The larger library ( $9 \times 10^9$  functional members)  
library of  $1.2 \times 10^9$  individual clones  
diversity of  $2 \times 10^9$   
diversity of  $1.5 \times 10^{10}$   
display library, comprising over 40 billion human antibody clones

$1.4 \times 10^{10}$  single-chain Fv  $1.3 \times 10^{11}$  clones

**250 billion clones**

large  $1.29 \times 10^{11}$  antibody fragment library  
library containing over  $10^{10}$  human antibodies  
How big you think your library is



# Antibody affinity maturation



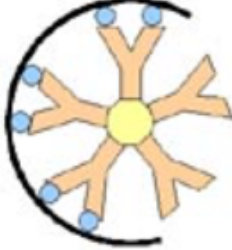
# Why increase affinity

- Increase 'biologic' activity of the mAb
  - Reduce the concentration of a soluble toxin or ligand
  - Use a lower dose of mAb to achieve the same potency



- Importance less clear for multivalent cell surface antigen where only binding is desired (as opposed to blocking ligand)
- Not useful for scFvs used in CAR T cells

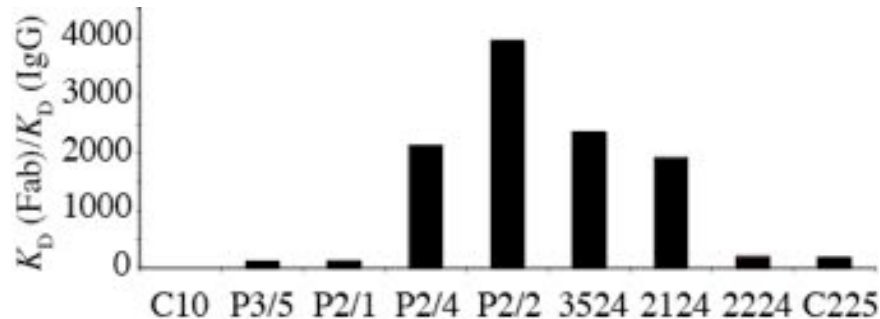
# The difference between affinity and avidity

		
$K_{eq} = 10^4$ Affinity	$10^6$ Avidity	$10^{10}$ Avidity

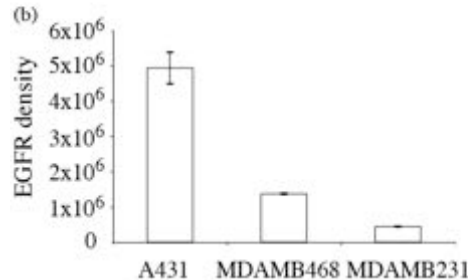
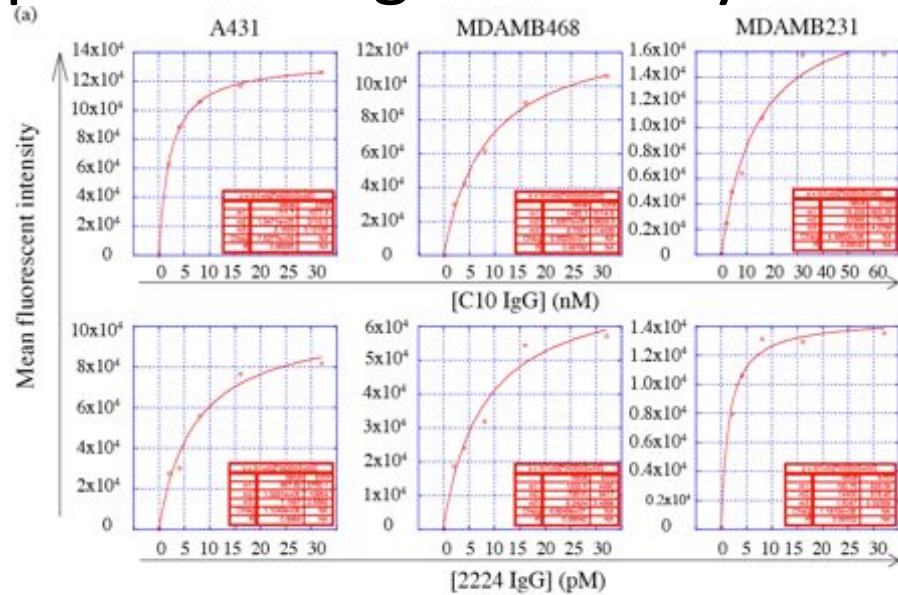


# Impact of intrinsic affinity on avidity

Antibody	scFv $K_D$ (nM)	Fab $K_D$ (nM)	IgG $K_D$ (nM)	$K_D$ (Fab)/ $K_D$ (IgG)
C10	263.67	124.23	1.17	106
P3/5	88.24	58.24	0.5	116
P2/1	14.81	25.4	0.012	2117
P2/4	15.39	25.2	0.0064	3938
P2/2	17.01	18.1	0.0077	2351
3524	7.47	15.4	0.012	1903
2124	9.90	1.31	0.007	187
2224	0.94	1.2	0.007	171
C225	NA	0.013	0.006	2



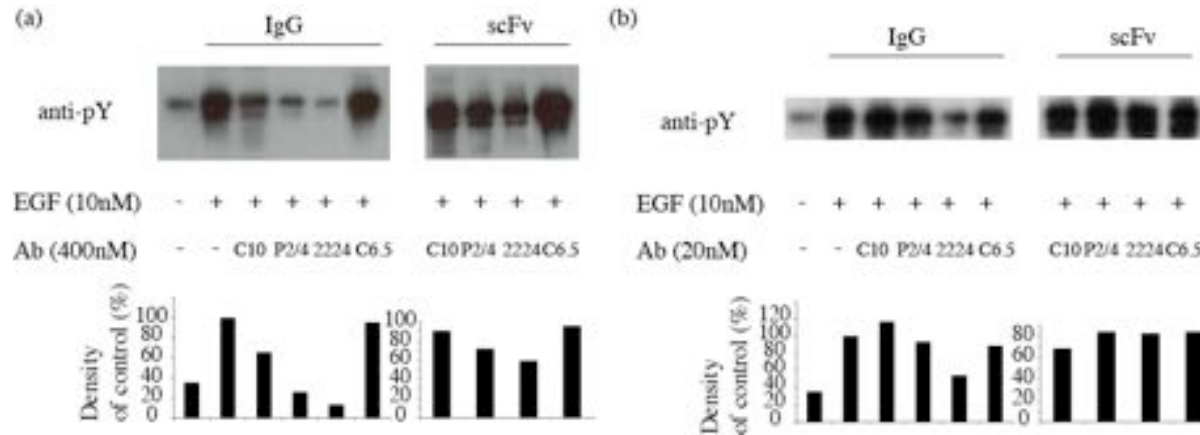
# Impact of antigen density on avidity



(c)

	Density ( $10^6$ )	$K_D$ C10-IgG ( $10^{-9}$ M)	$K_D$ 2224-IgG ( $10^{-12}$ M)
A431	4.90	2.18	7.16
MDAMB468	1.37	8.74	8.24
MDAMB231	0.44	13.83	1.5

# Impact of intrinsic affinity of signaling inhibition

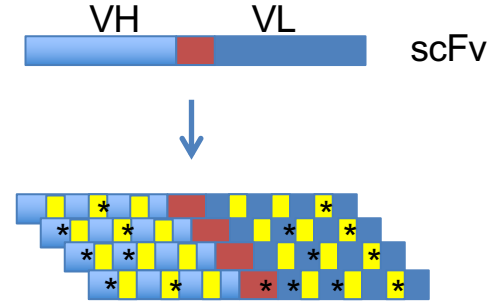


# Overview of affinity maturation

- How and where to introduce mutations
- Display platform to use
- Selecting rare higher affinity binders from lower affinity binders
- Identifying and characterizing the higher affinity antibodies

# How and where to introduce mutations

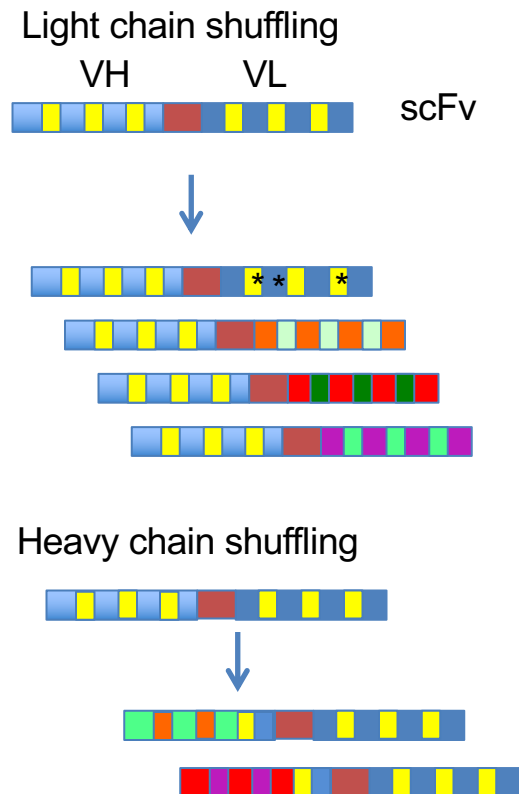
- Randomly
  - Error prone PCR
  - Mutator strains of E. coli
  - Intrinsic in ribosome display
  - Advantages
    - Simple, requires no design effort
  - Disadvantages
    - Frequently obtain multiple mutations in both CDRs and frameworks
    - Some mutations in frameworks and affect stability, expression, aggregation
    - Some mutations may have no impact or negative impact on affinity



# How and where to introduce mutations

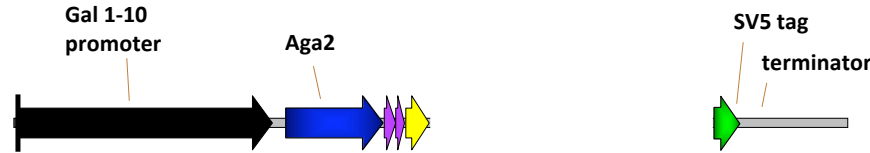
- Chain shuffling

- Esp. for immune libraries
  - Library size results in binding VH sampling only one or a few VL
- Sample variants of same germline V-gene as well as many other germline genes
- Tests mutations in 3 CDRs simultaneously
- Most common is light chain shuffling
- If VH shuffling, frequently maintain VH CDR3

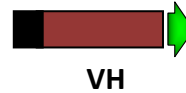


# Light chain shuffling by yeast display

Clone VH and VL directly into yeast together using gap repair:



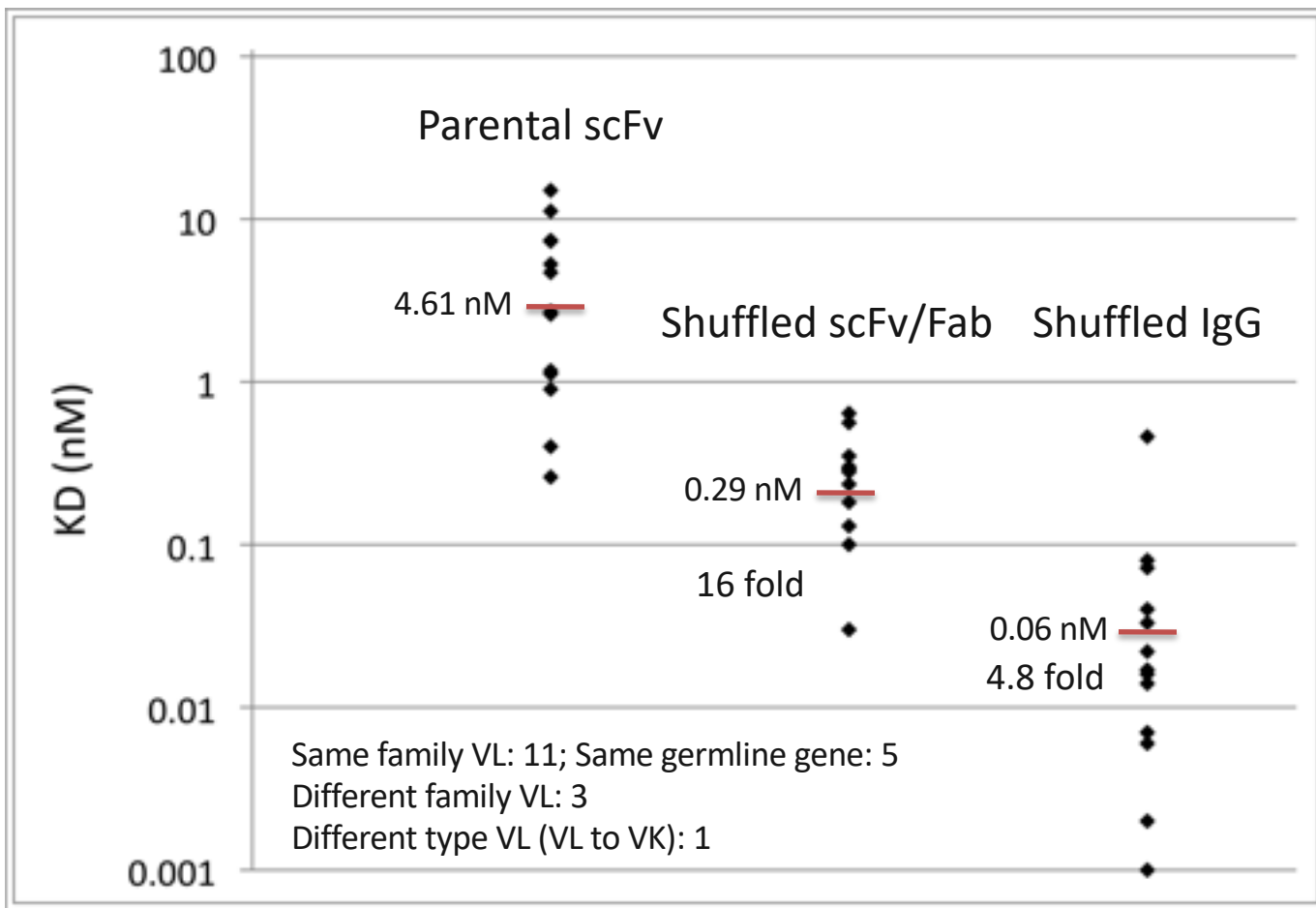
VL library – doesn't have to be from original immune repertoires



Original VH

- Double cut vector
- Generate PCR fragments with > 25 bp overhang
- Mix vector & insert and transfect
- Efficiency 1->100E6/ug insert

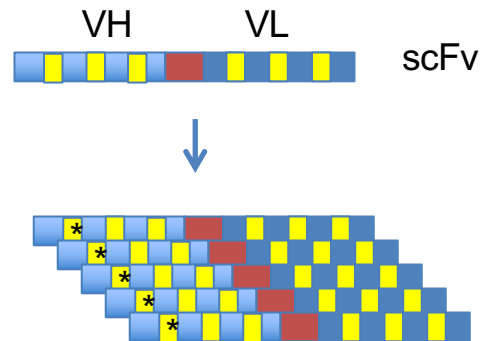
# BoNT mAb affinity maturation by chain shuffling (10 scFv, 3 Fab)





# How and where to introduce mutations

- Site directed into the CDRs
  - Only insert mutations into CDRs, not frameworks
  - Most likely to generate new antigen contacts or modify side chain position
  - Allows iterative improvement by moving from CDR to CDR

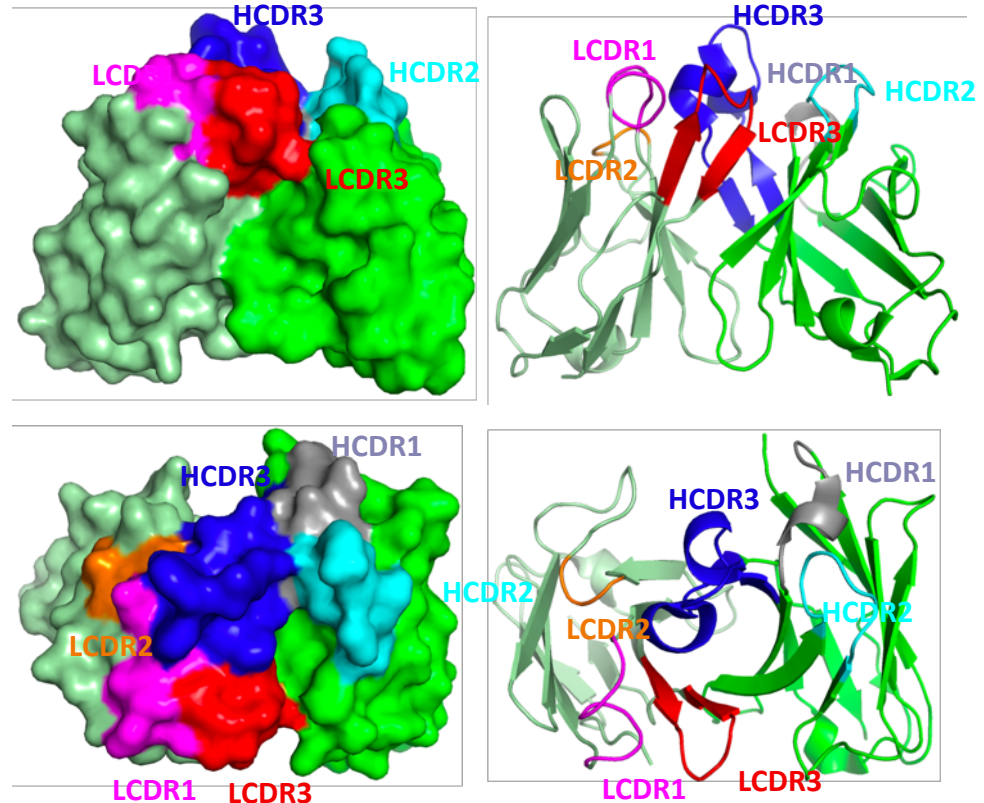


# How to introduce CDR mutations

- Random using NNS coding
  - Cheap
  - Requires no thinking
  - Introduces stop codons, cysteines and many non-naturally occurring amino acids at each positions.
  - Most sequences do not encode any of the original amino acids in the CDR
    - Destroys binding
  - Limited sampling of sequence space
    - $32e5 = 3.4e7$
- Spiked oligonucleotides
  - Preferred approach
    - 25-50% wild type aa at each position
      - 70:10:10:10 nucleotide mix at positions 1 and 2, G/C at position 3
      - Allows testing of every possible single double and triple mutation at any position randomizing 6 aa
      - Usually enough for any single CDR
      - 4 CDRs maximum for any antibody
      - Sequentially or simultaneously
- Array based oligonucleotides
  - No redundancy
  - More expensive
  - All single and double mutations for one CDR can be exhaustively analyzed

# Where to introduce CDR mutations

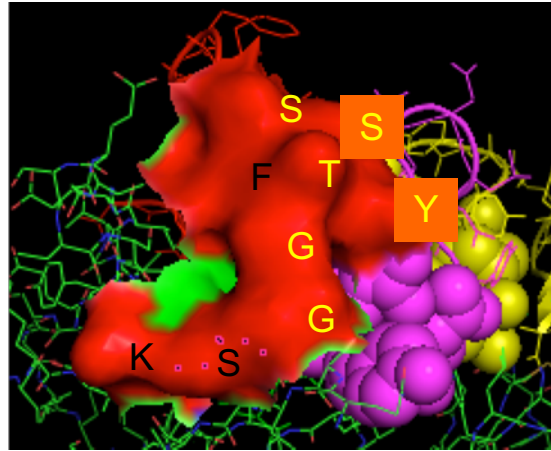
- Greatest germline diversity in center of combining site
  - VH CDR3 >>>> VL CDR3
  - Best to leave HCDR3 to last because of possible effect on affinity
- Preferred to start with VL shuffling, then, order of mutation:
  - H1, H2, L3, L1, H3
  - Mimics somatic hypermutation
- If no chain shuffling, order of mutation:
  - L3, H1, H2, L1, H3
- Can perform sequentially, or simultaneously and combine mutations



# Solvent (antigen) accessible residues are a subset of CDR residues

*HV1-69 & KV3-15*

SCKASGGTFSSYAI<sup>SWV</sup>

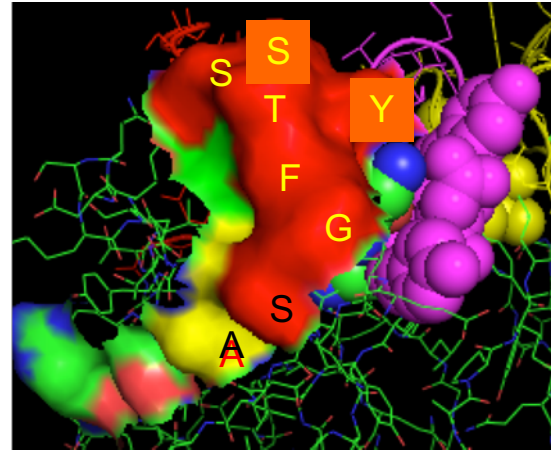


Surface residues red

Mutant oligo = GTFSSY

*HV3-23 & KV1-69*

SCAASGGTFSSYAM<sup>SWV</sup>



Surface residues red

Mutant oligo = FTFSSY

KABAT CDR residues

CDR residues common to KABAT and structure (IMGT)

Structural (IMGT) residues

H3 in magenta;  
CDRLs in yellow

# What display system to use

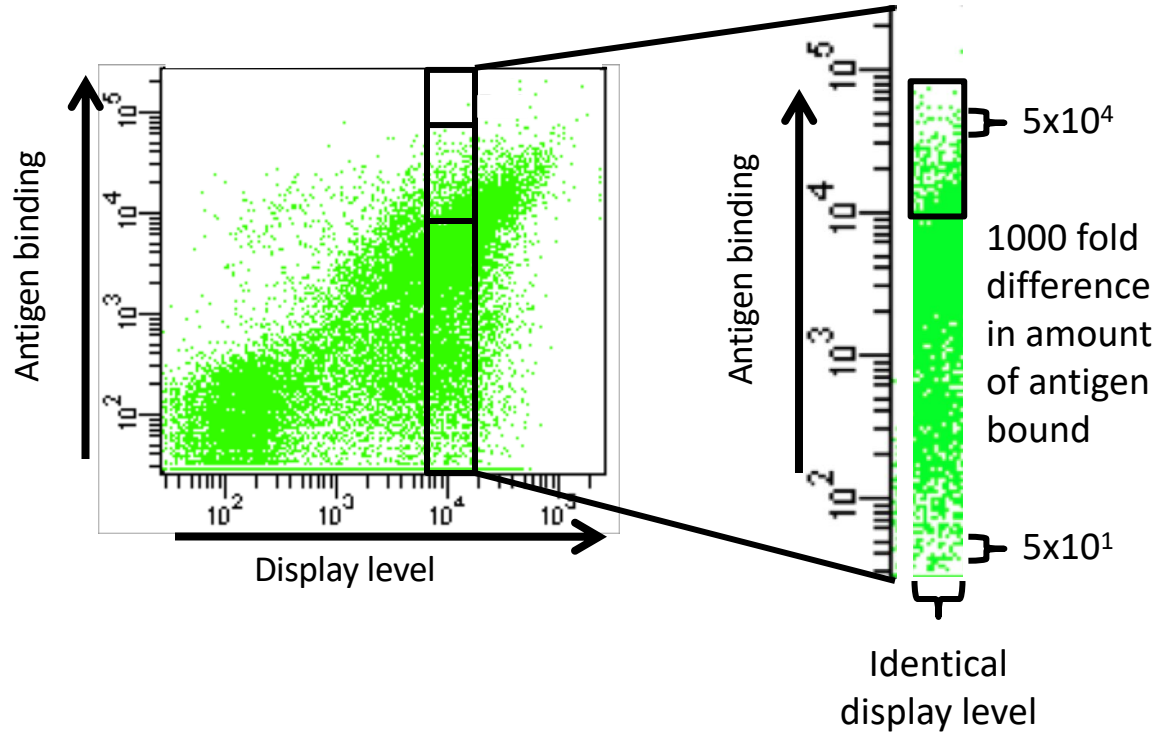
- Phage display
  - Simple
  - Examples of > 1000 fold increases in affinity using sequential spiked oligo libraries
  - Use biotinylated monovalent antigen, decrease concentration each round
  - Need to secrete Ab fragment for affinity measurement
  - Can obtain off rate with unpurified fragment, need purified fragment for KD due to variability in fragment concentration
  - Black box: cannot see what is happening each round of selection

# What display system to use

- Yeast display
  - More complex, need to understand flow cytometry
  - Sense that large libraries hard to construct, but straightforward using gap repair
  - Can measure 'library KD' at each round of selection to tailor antigen concentration, and can see on cytometer success of staining in separating clones of different affinity
  - Can measure KD on the display platform

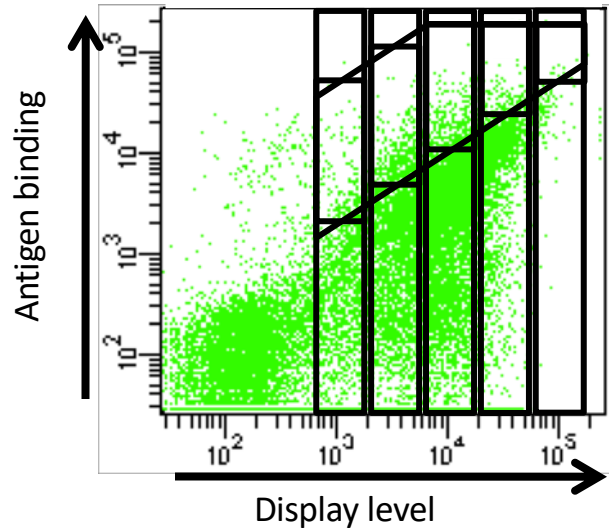
Affinity maturation using yeast display

# Sorting for higher affinity

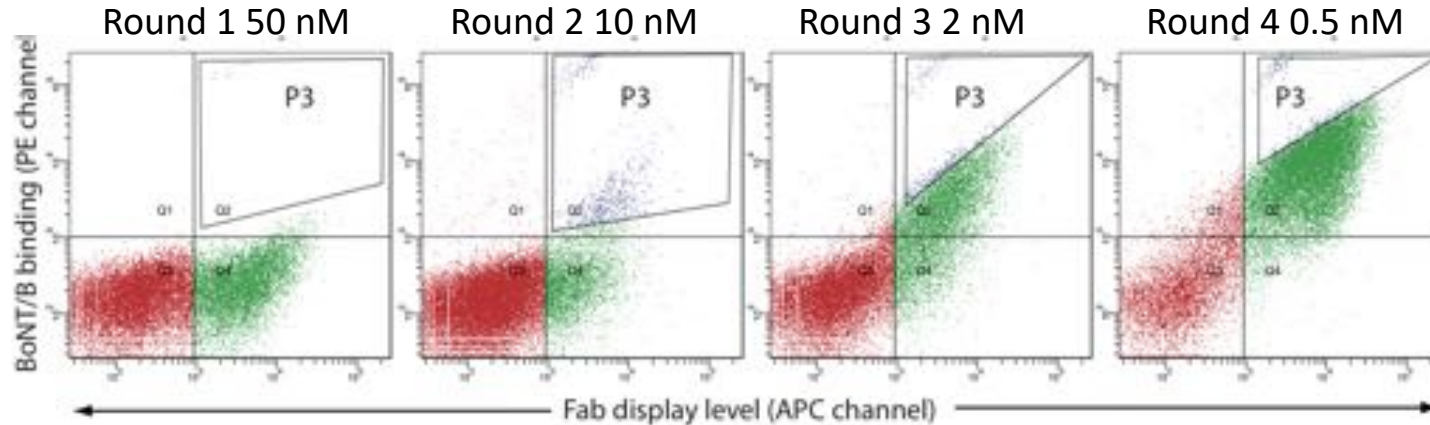




# Sorting for higher affinity



# Affinity maturation points to consider



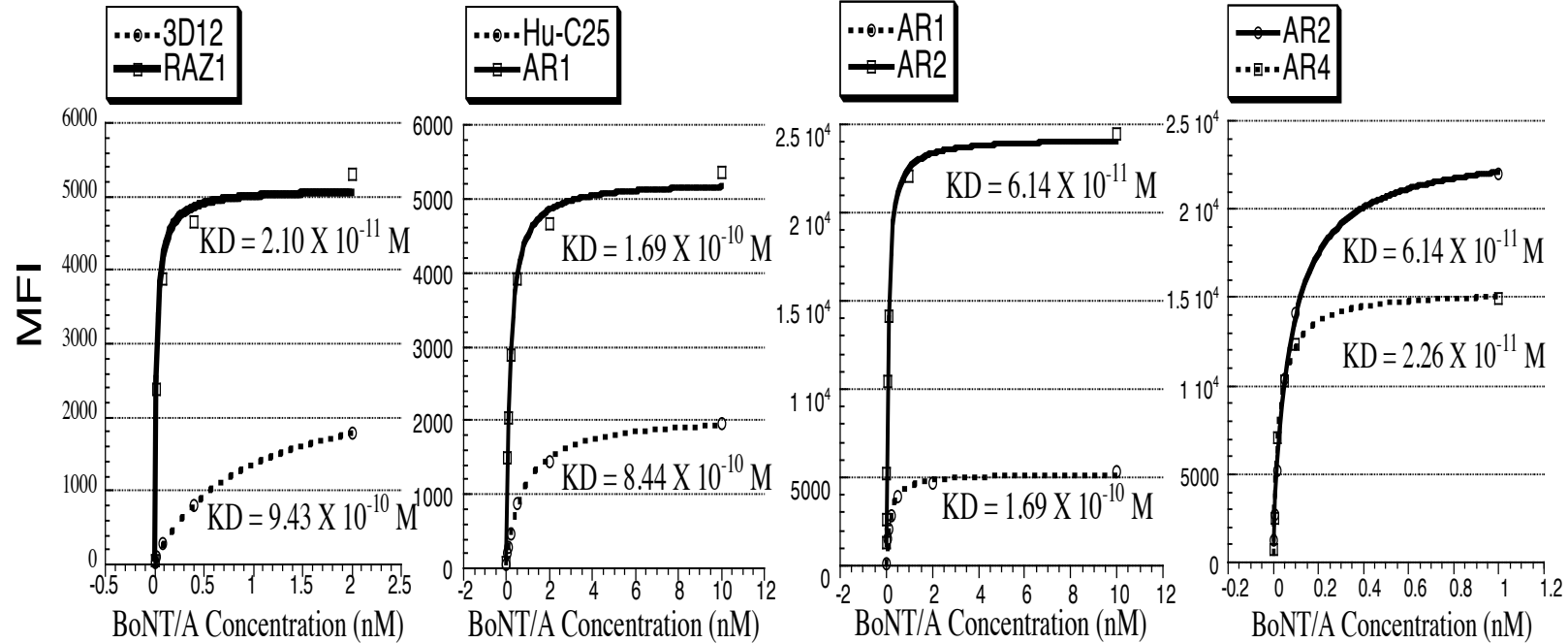
- Generally gate 0.1% of the binding population, except 1<sup>st</sup> round
- Sort with different antigen concentrations, and use concentration that separates the binding population most, but is above background
- If doing equilibrium sorts, calculate the time to eq. and try to reach this, also ideally in antigen (mole) excess:
  - e.g. typically 5e5 scFv/yeast, staining 10e6 yeast
  - at 7.5 pM requires 100mL volume to be in 10 fold antigen excess
- Library K<sub>d</sub> should improve between rounds
- Below K<sub>D</sub> of 1 nM, consider on rate/off rate staining
  - Stain for short period of time not achieving equilibrium
  - Wash, incubate in large volume and in presence of unlabelled Ag to prevent rebinding
- Convert multiple Ab fragments to IgG

$$t_{\otimes} = \frac{-\ln(1 - \Theta)}{k_a \cdot C + k_d}$$

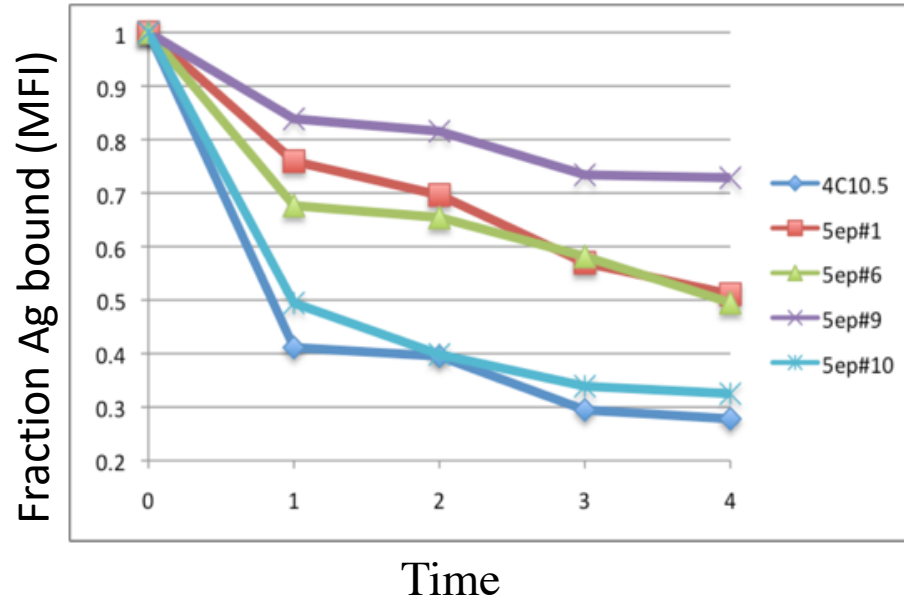
# Individual clone characterization

- Between rounds stay in liquid culture
- Plate after last round of sorting
- Pick individual colonies, sequence and induce unique clones
- Measure KD of antibody fragment on yeast surface
- Convert to IgG and measure KD

# Measuring KD's of yeast displayed scFv



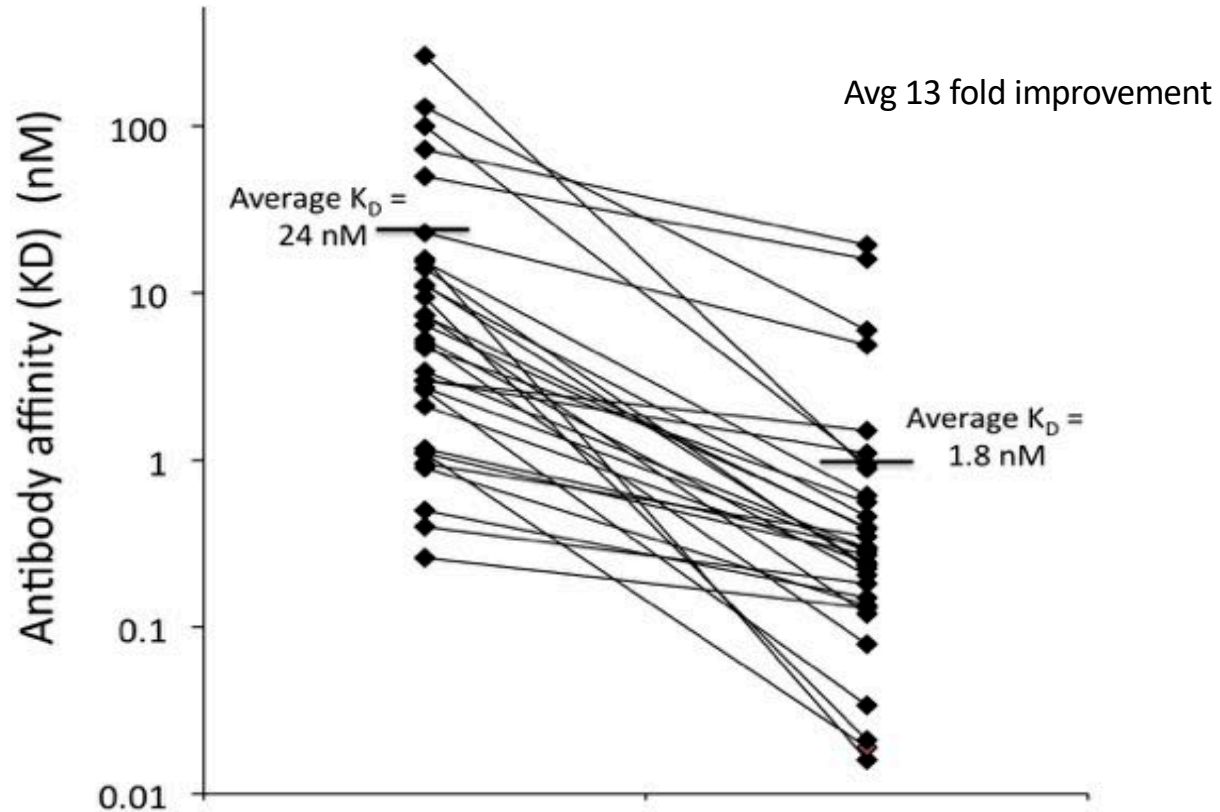
# Use of yeast based off-rate screening to identify higher affinity mAbs



All of these  
have  
similar  $K_d$ s

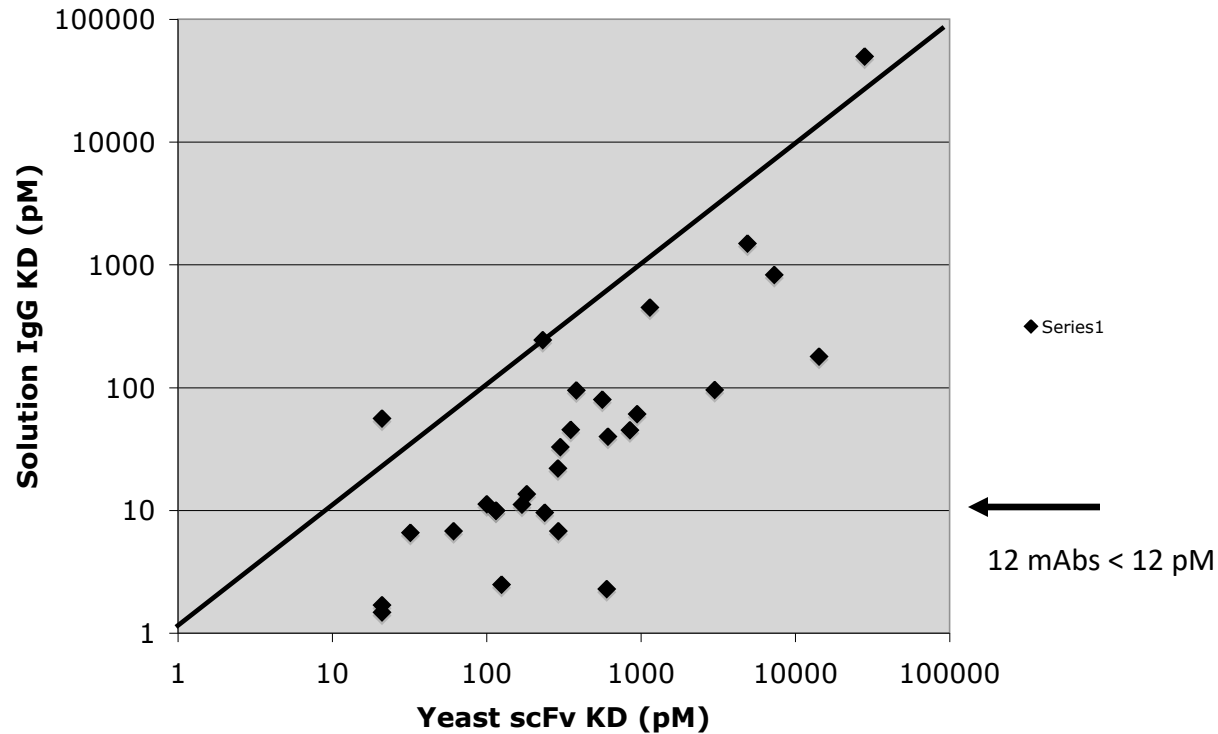
- Incubate yeast with Ag to equilibrium
- Wash, let dissociate and block rebinding
- Measure MFI
- Allows prediction of antibodies that will perform better as IgG

# Affinities of lead and affinity matured scFv and Fab (32 antibodies, 26 scFv, 6 Fab)



# Affinities of BoNT yeast displayed scFv and IgG in solution

12 primary libraries, 30 secondary libraries: 30 scFv converted to IgG



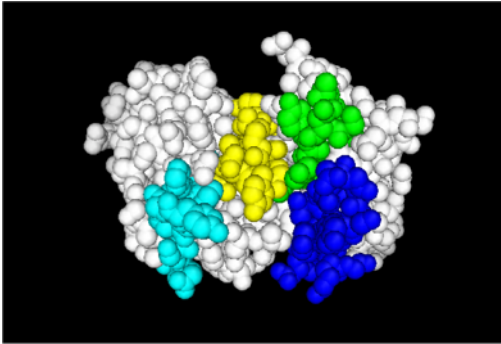
# Evolving cross reactive mAbs

Four separate libraries made (H1, H2, H3 L1) but only HCDR1 library cross-reactive Abs

## AR2

KD A1 =  $5.0 \times 10^{-11}$  M

KD A2 =  $2.0 \times 10^{-7}$  M



## CR2

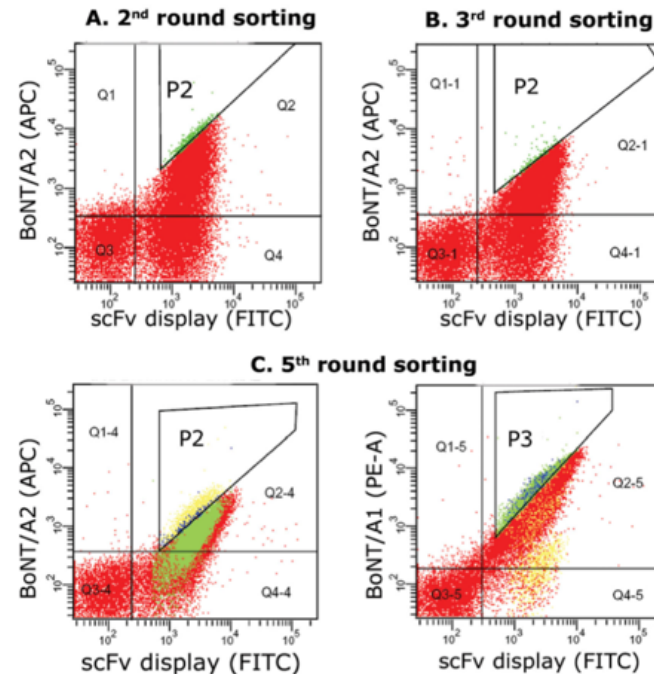
KD A1 =  $6.5 \times 10^{-11}$  M

KD A2 =  $3.0 \times 10^{-10}$  M

Four separate libraries made (H1, H2, H3 L1) but only HCDR1 library cross-reactive Abs  
Sort for P2+P3 in 5<sup>th</sup> round

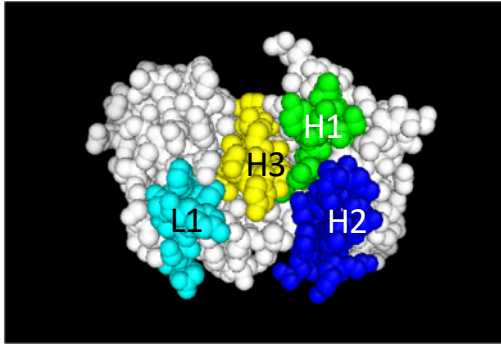
VH CDR1 GFTFS DHYMY

VH CDR1 GFTFK YDHYMY





# Evolving cross reactive mAbs



## AR2

KD A1 =  $5.0 \times 10^{-11}$  M

KD A2 =  $2.0 \times 10^{-7}$  M

## CR2

KD A1 =  $6.5 \times 10^{-11}$  M

KD A2 =  $3.0 \times 10^{-10}$  M

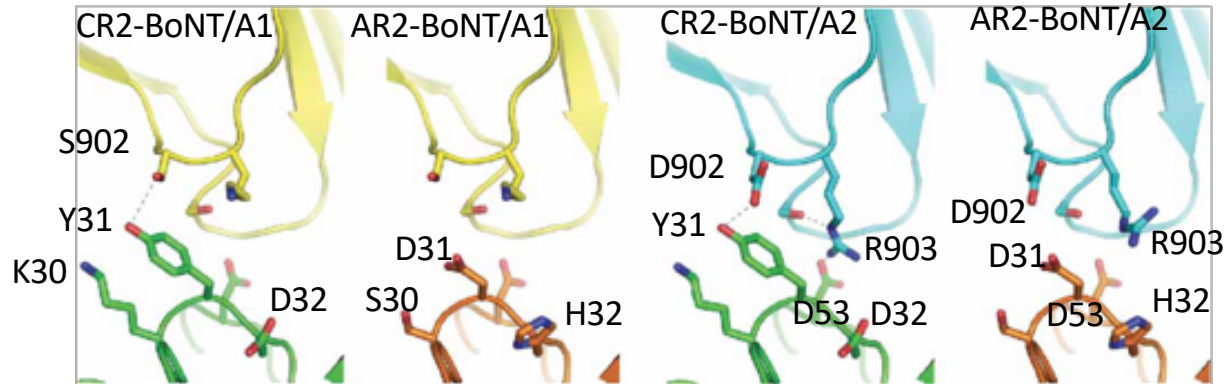
31

VH CDR1 GFTFS DHYMY

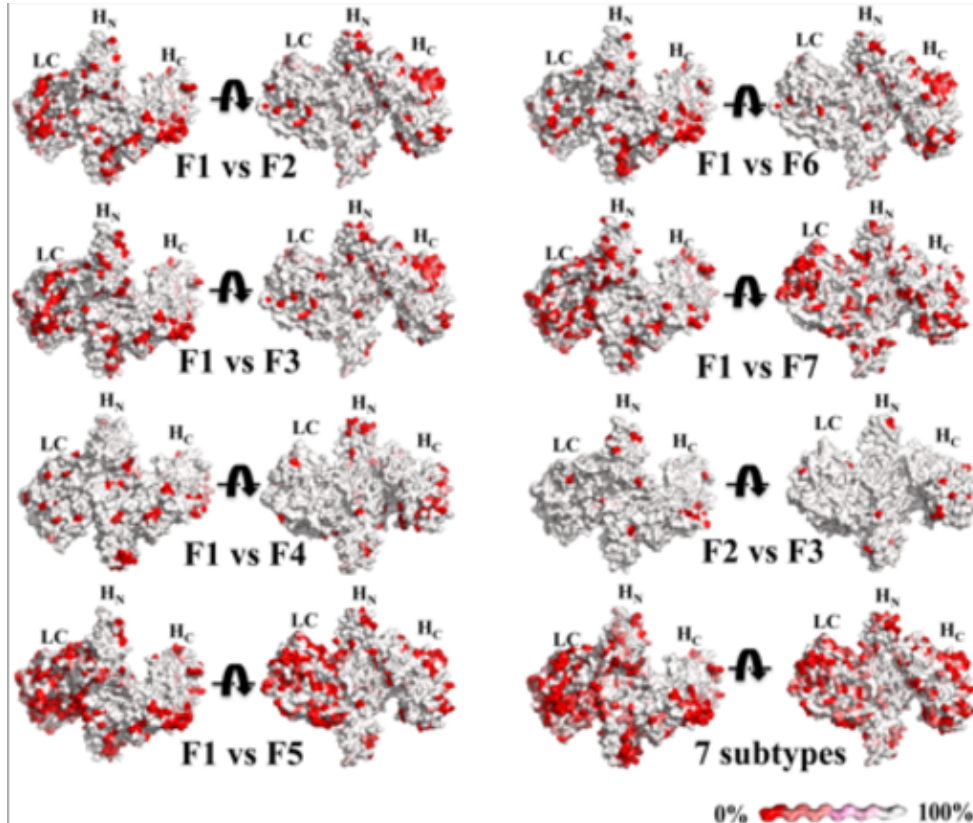
VH CDR1 GFTFKYDYMY

30

32

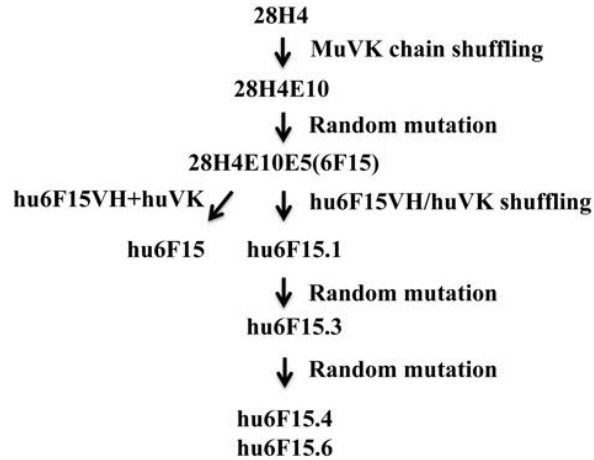


# Evolving cross reactive BoNT/F mAbs



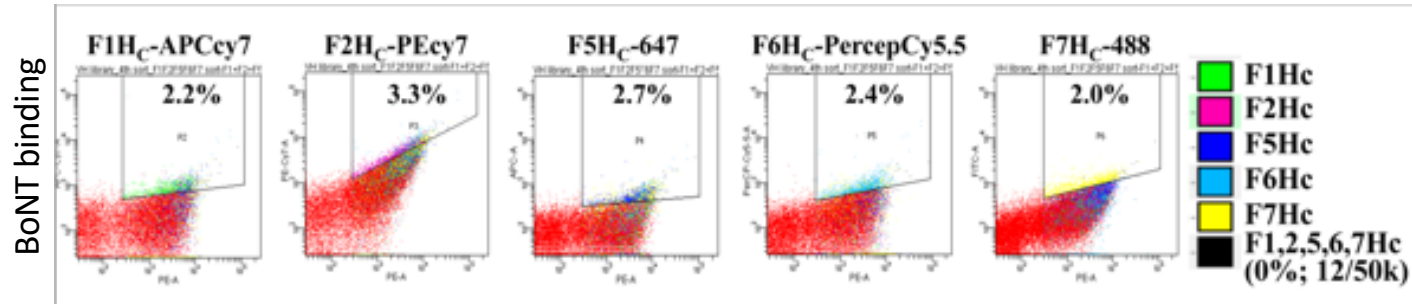
BoNT/F subtypes  
differ by up to  
36%

# Engineering cross reactive BoNT/F mAbs



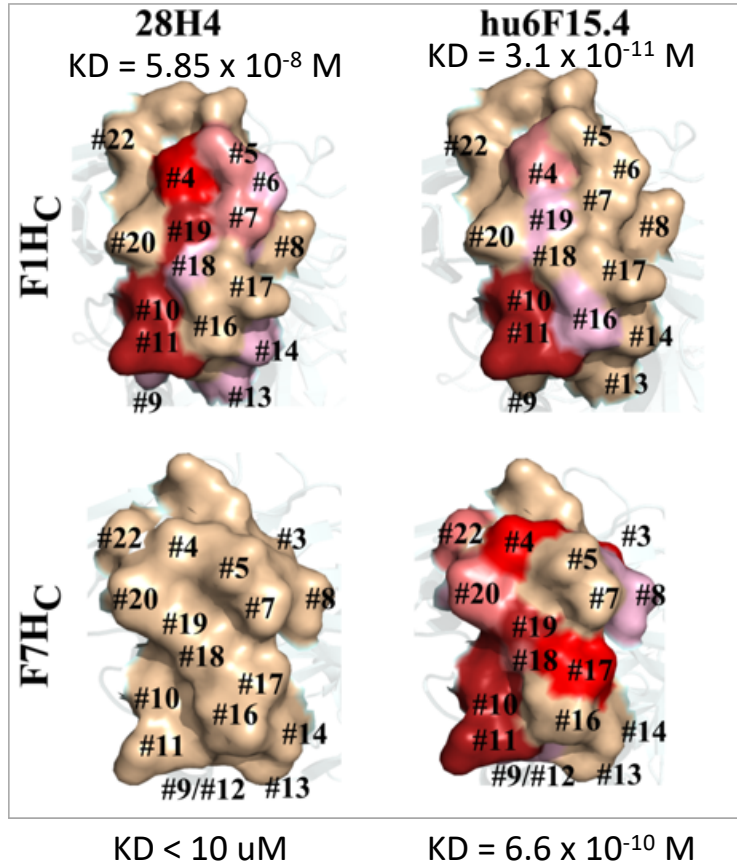
$KD = \text{BoNT/F1} = 5.85 \times 10^{-8} \text{ M}$

$KD \text{ BoNT/F7} < 10 \text{ uM}$



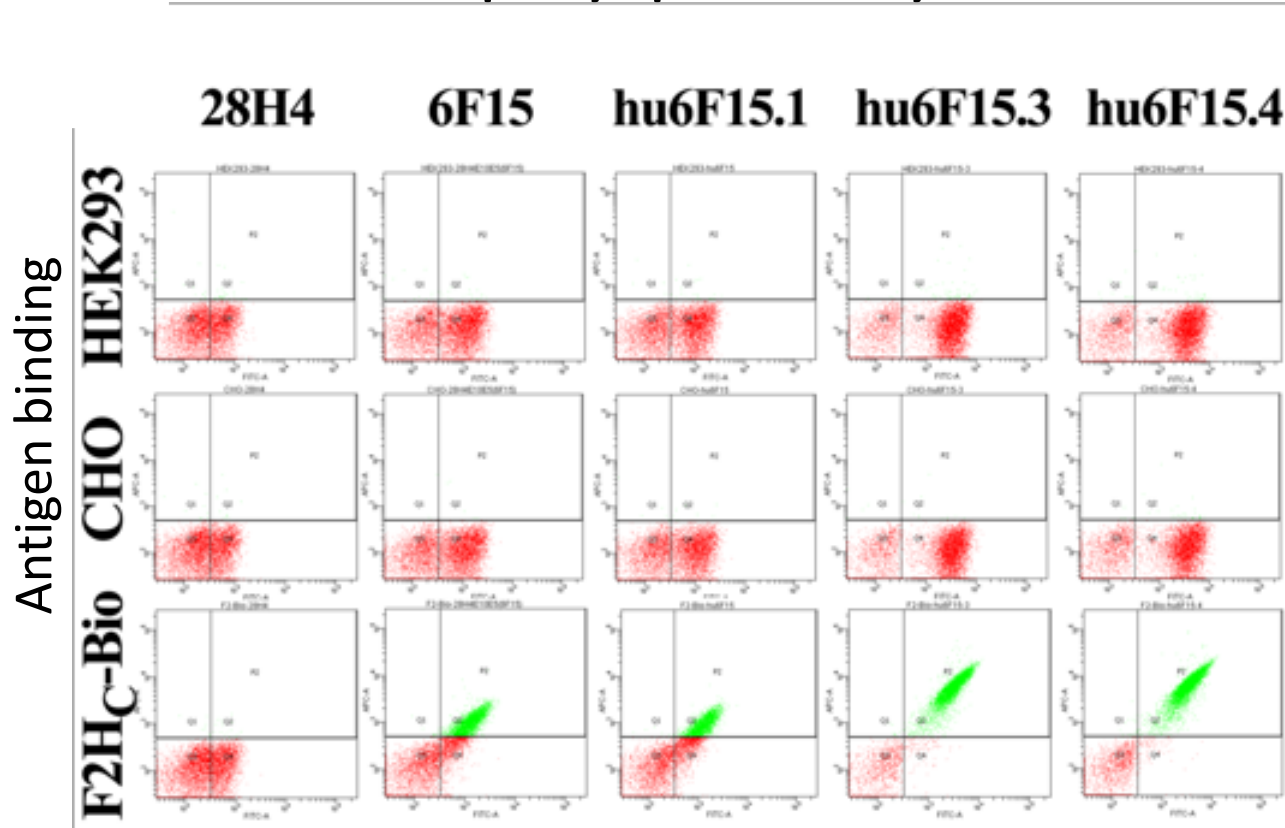
Label yeast displayed Hu6F15.3 scFv library with five different subtypes of BoNT/F labeled with different fluorescent dyes

# Mechanism of increased cross reactivity



- Increase affinity for shared contacts between subtypes
- Reduce importance of different contacts for binding to BoNT/F1 subtype
- Increase affinity for different contacts in BoNT/F7

# Engineered cross reactivity does not result in polyspecificity



# Selecting clones to convert to IgG

- Pick multiple of different sequences and highest KD
  - Some may not be developable
  - At  $KD < 1$  nM, similar yeast KD may give very different IgG KD
    - Measure clones with slowest off rates
    - Pick top 6 clones to make as full length IgGs

# Antibody characterization and developability

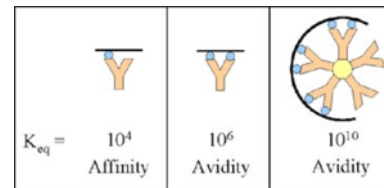
# Antibody characterization

- Affinity
- Biologic activity
- Epitope
- Expression
- Sequence
- Specificity
  - Self-aggregation
  - Solubility
- Stability



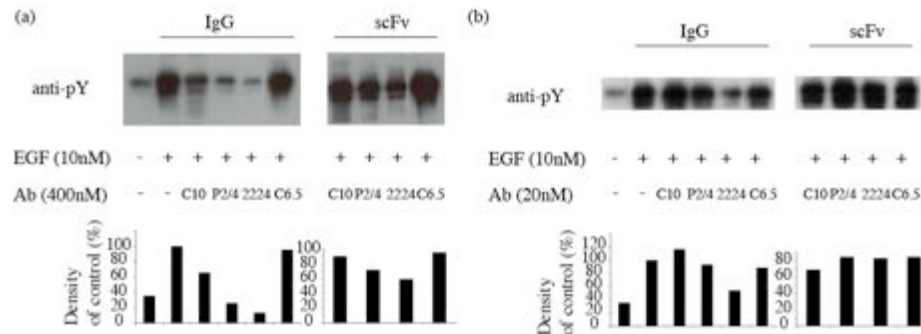
# Antibody characterization

- Affinity & biologic activity
  - Monovalent intrinsic affinity vs avidity
    - Be sure that measurement not being performed where avidity may confound (e.g. Fc fusion protein)



## – Biologic activity

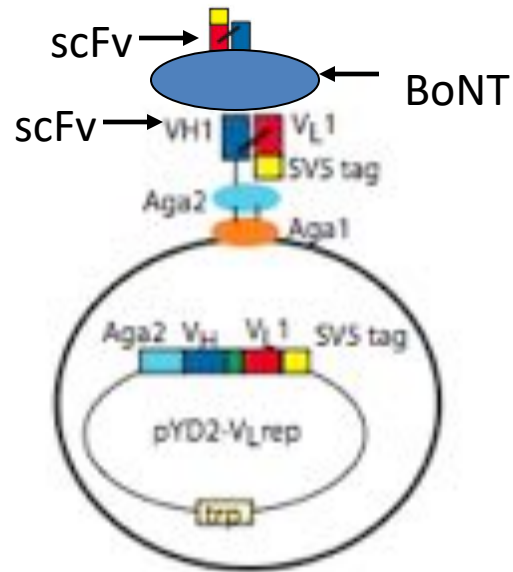
- In vitro vs in vivo



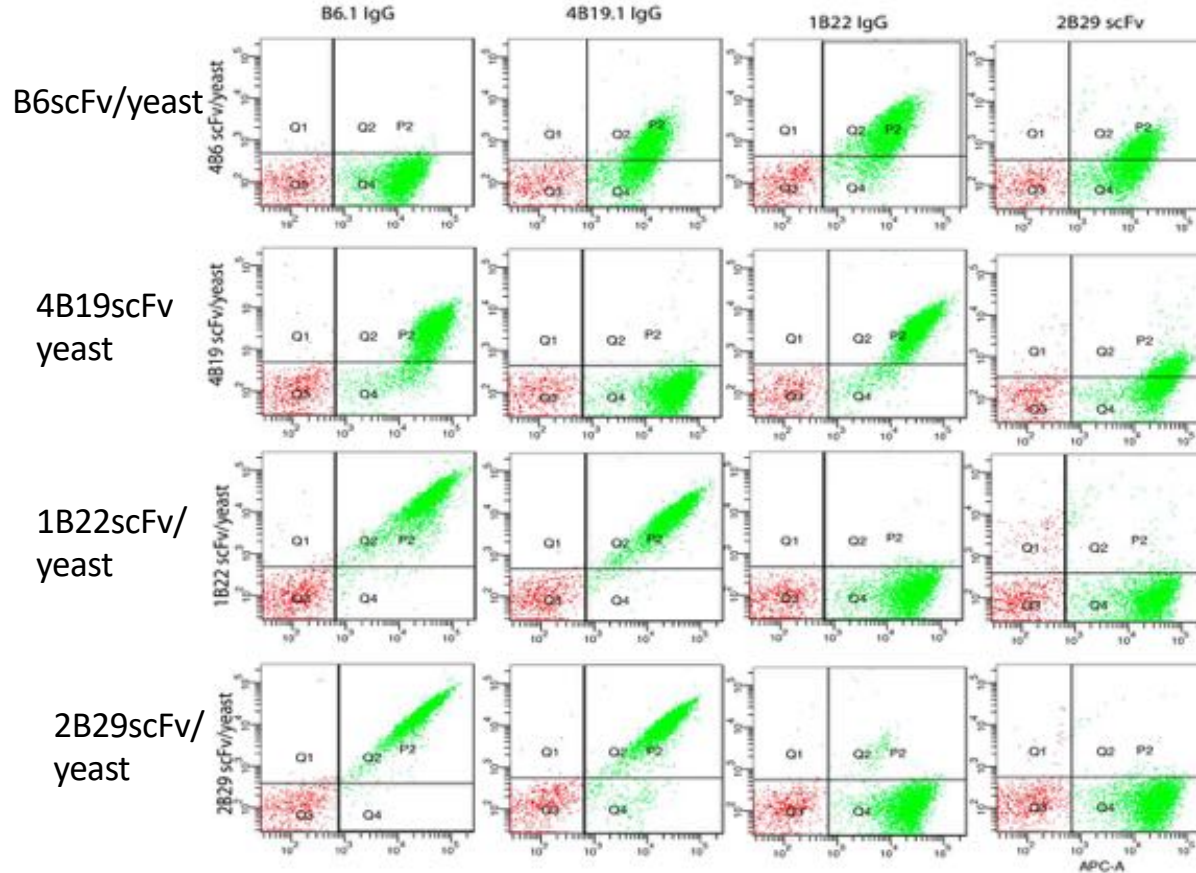
# Antibody characterization

- Epitope
  - Important to
    - Understand structure function relationship of mAb-Ag interaction
    - May be necessary if cannot isolate cross reactive mAb to show homologous epitopes for murine and human binding mAbs
  - Binning mAbs by overlap
  - At a domain level
  - Fine epitope

## Mapping antibody epitopes for overlap

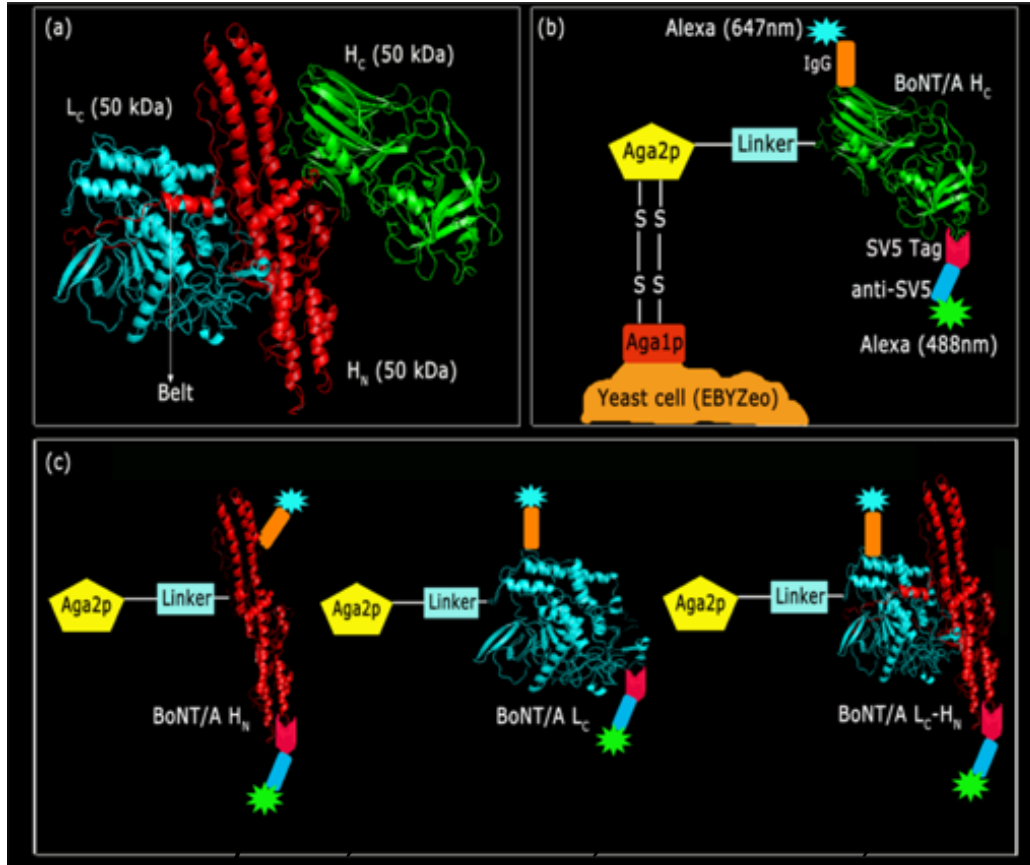


# Epitope mapping antibodies by flow cytometry

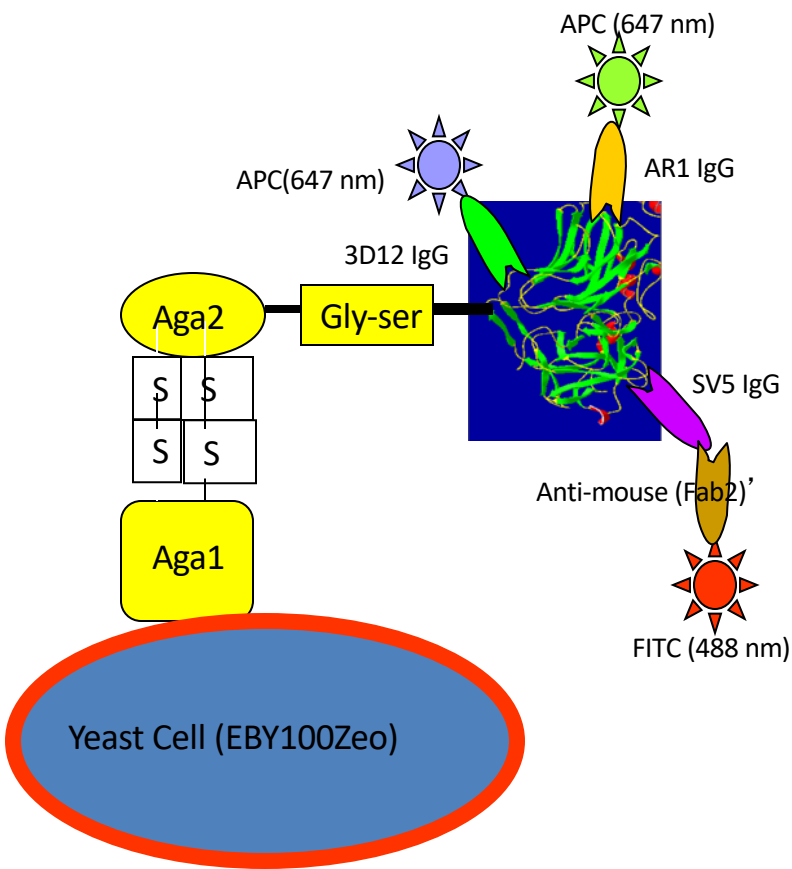


# Yeast displayed (BoNT) domains

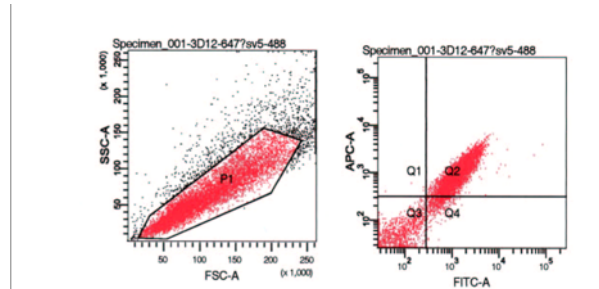
## Domain and fine epitope mapping



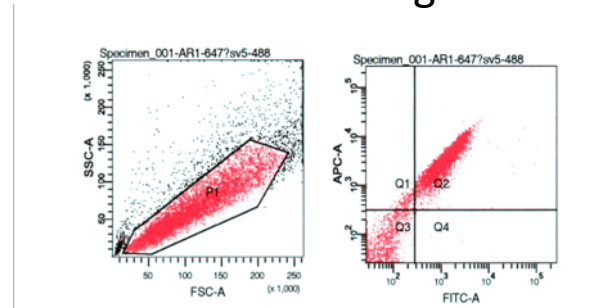
# BoNT/HC Yeast display for domain epitope mapping



## 3D12 binding

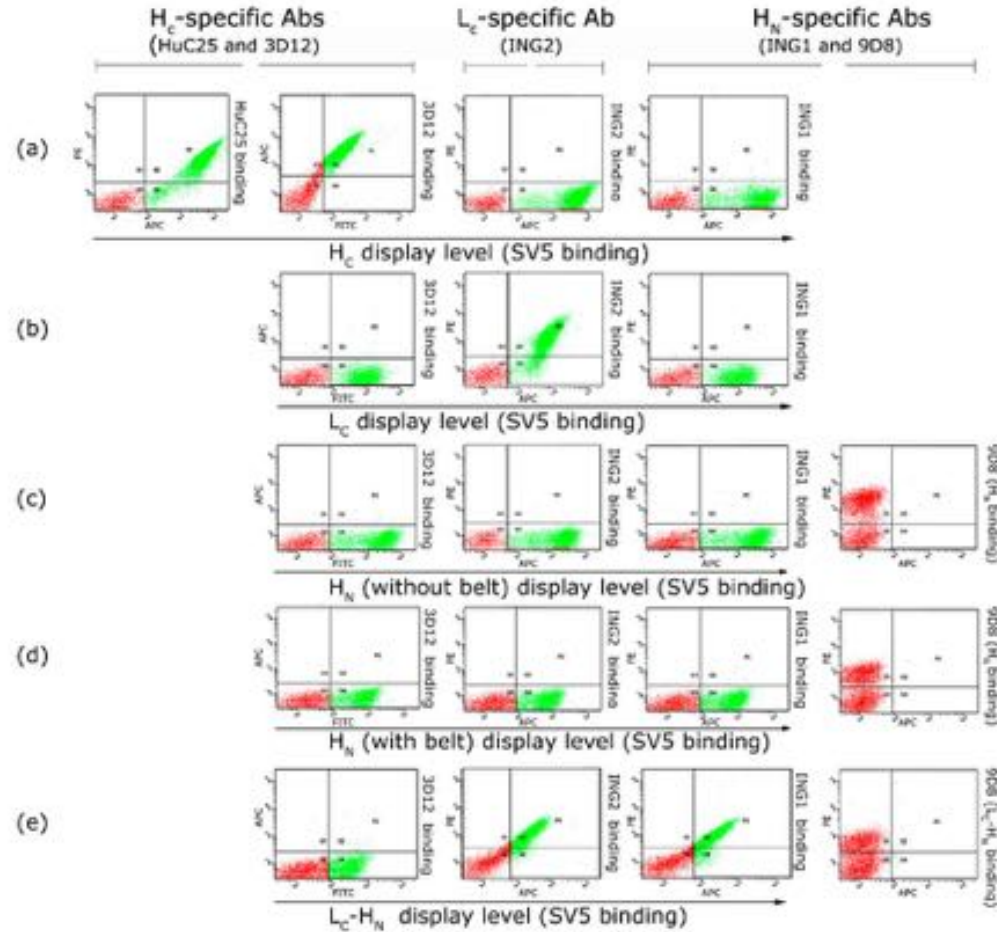


## AR1 binding



Antibodies binding to yeast displayed Bot domain

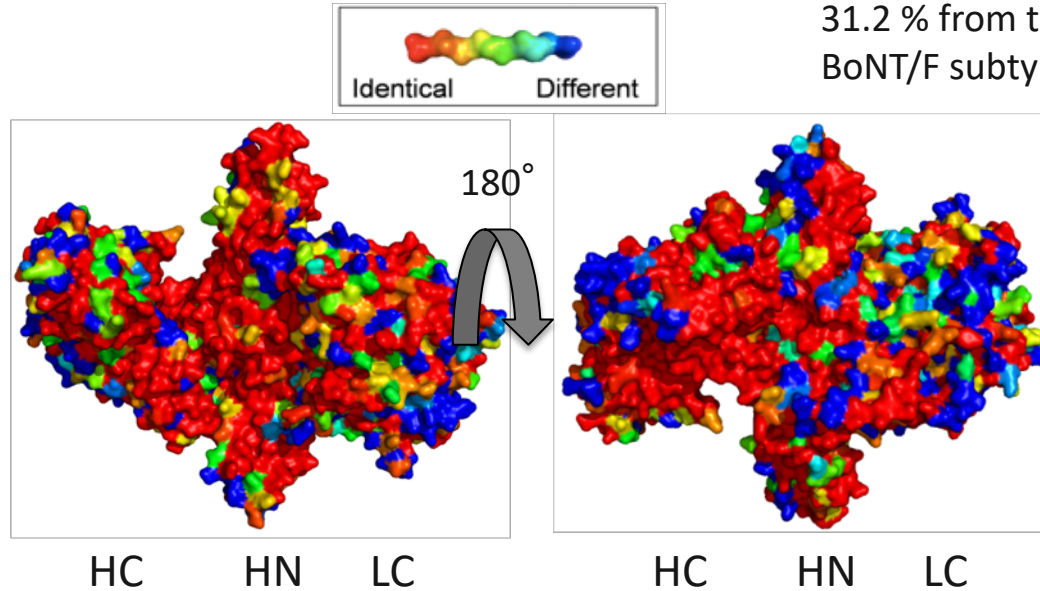
# BoNT/A domain display



# BoNT/F subtype sequence variability

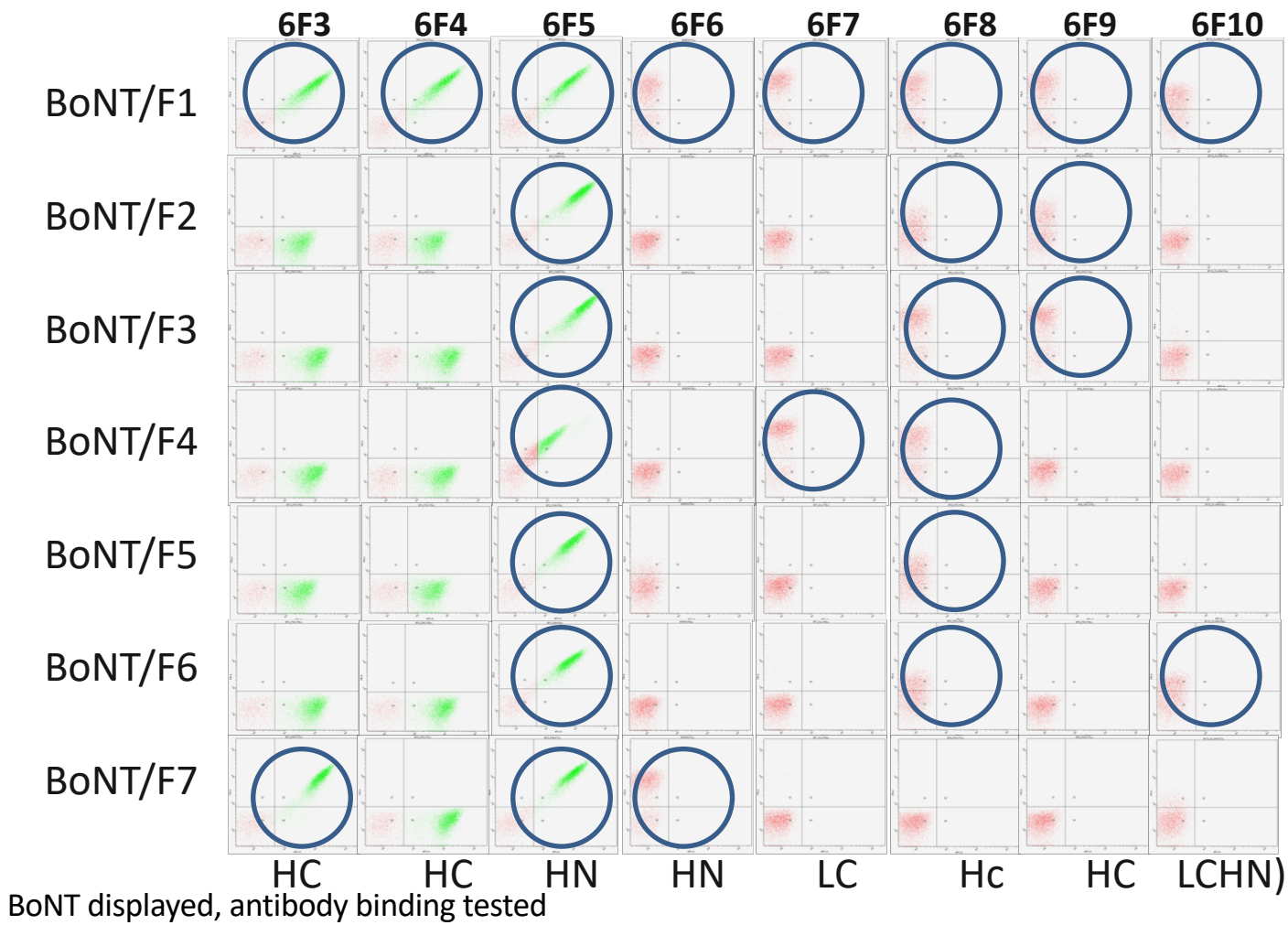
## Seven subtypes

BoNT/F1 differs by 16.6 to 31.2 % from the other BoNT/F subtypes



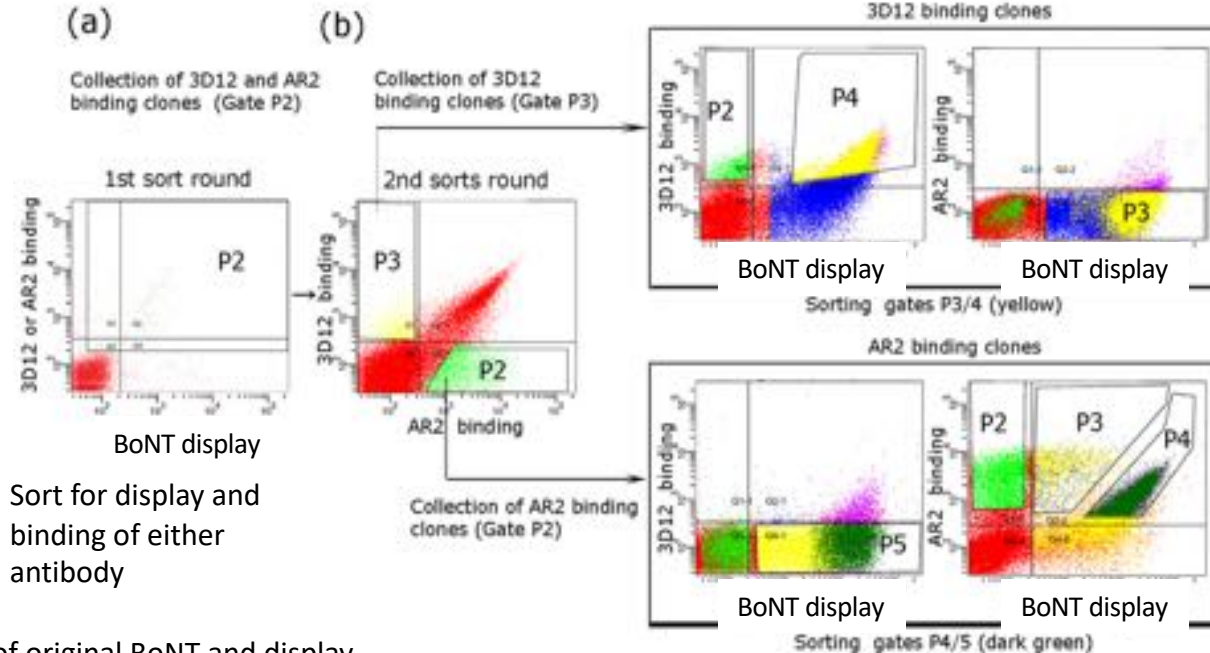


# BoNT/F mAb Cross reactivity



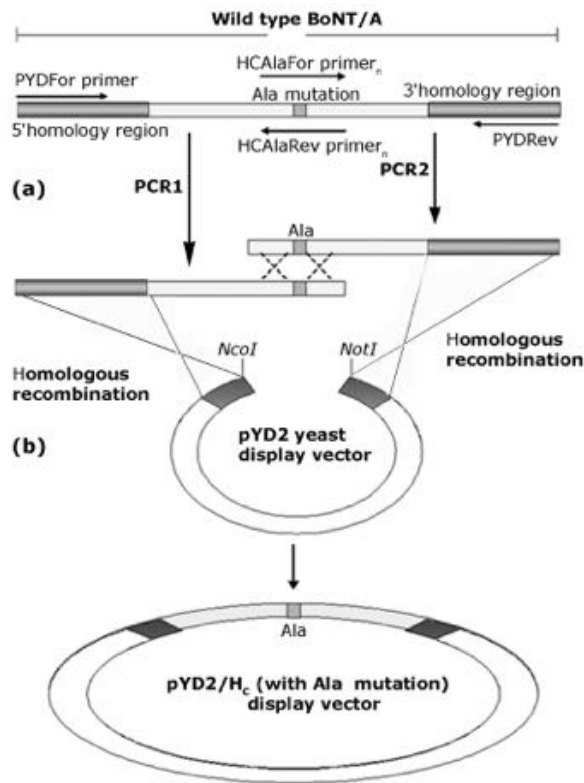
# Sorts for fine epitope mapping of BoNT/A antibodies

(c)

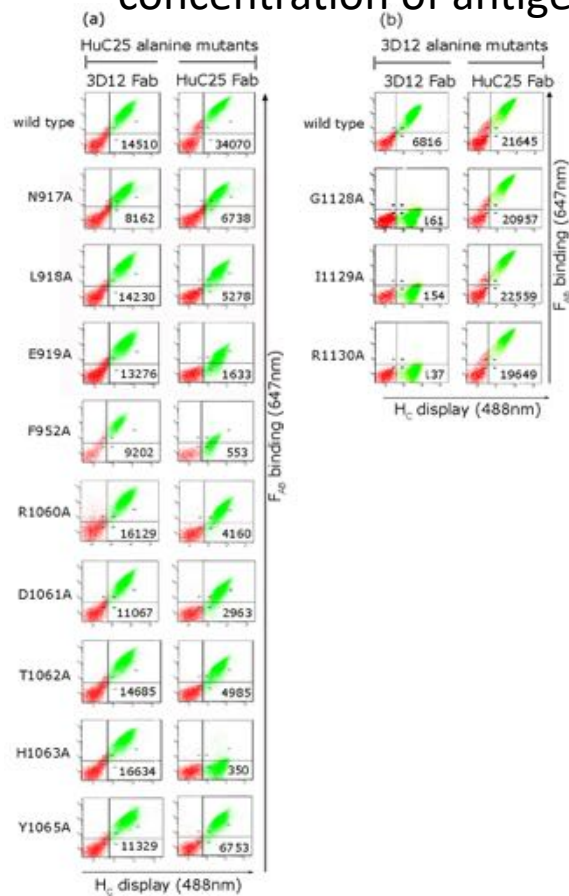


- Error PCR of original BoNT and display
- Use 3D12 and AR2 to select for correctly folded BoNT
- Sort for lack of binding for other antibody
- Sequence single clones of desired phenotype
- Model location of mutations to identify putative epitope

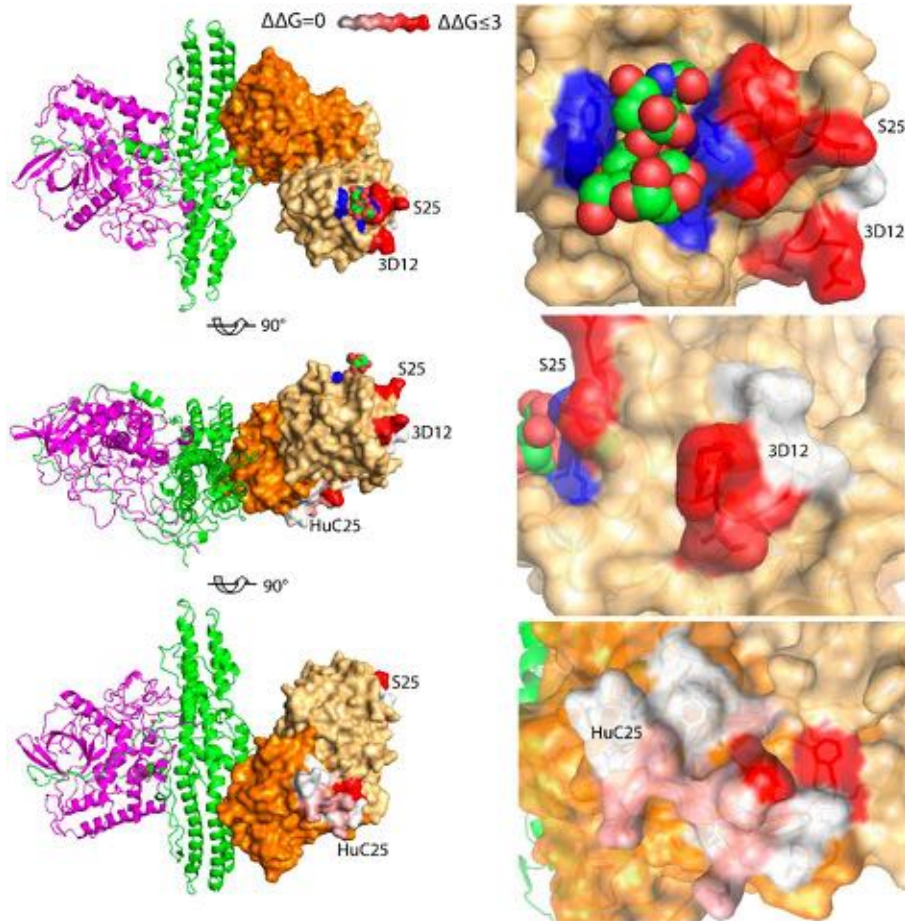
Generate single alanine mutants by homologous recombination



Identify mutants that affect binding, measure MFI at KD concentration of antigen



## BoNT/A domain display



mAb epitopes

S25

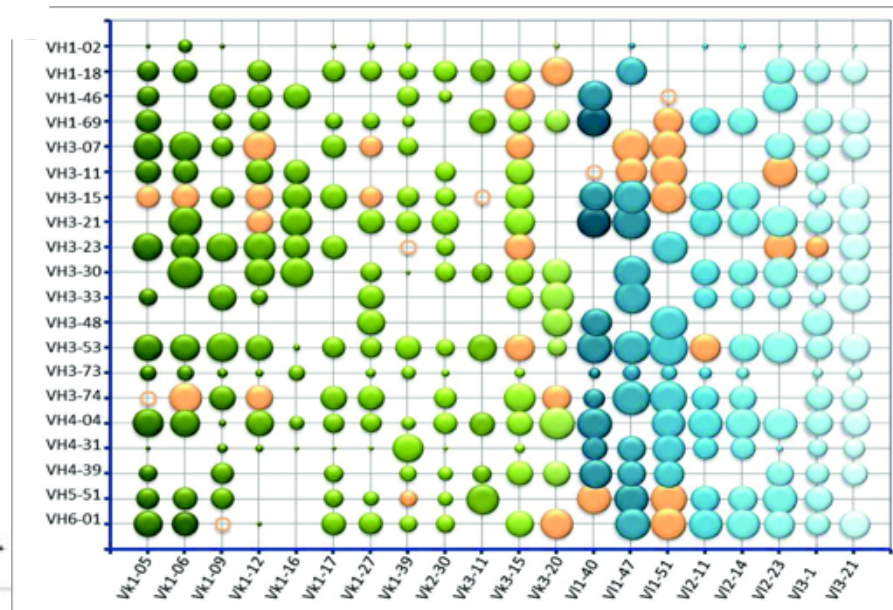
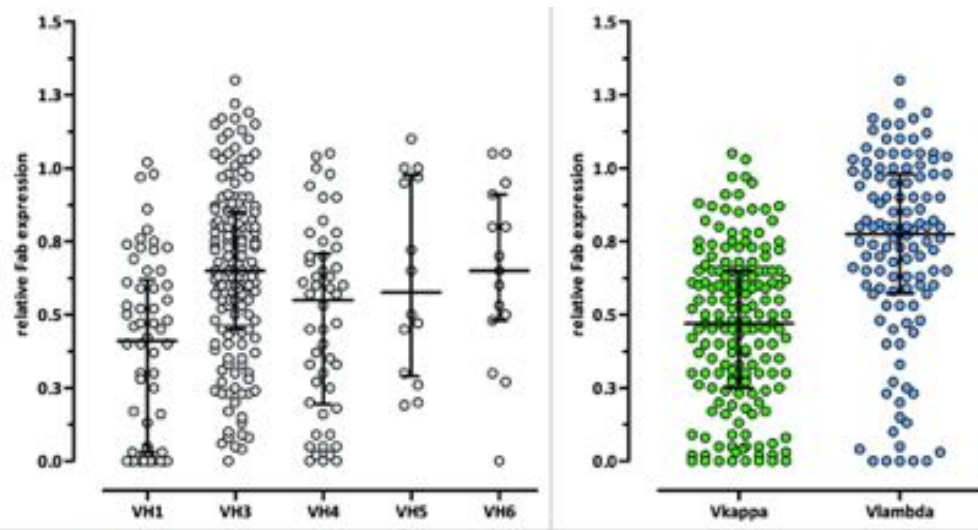
3D12/RAZ1

HuC25/CR2

# Antibody characterization

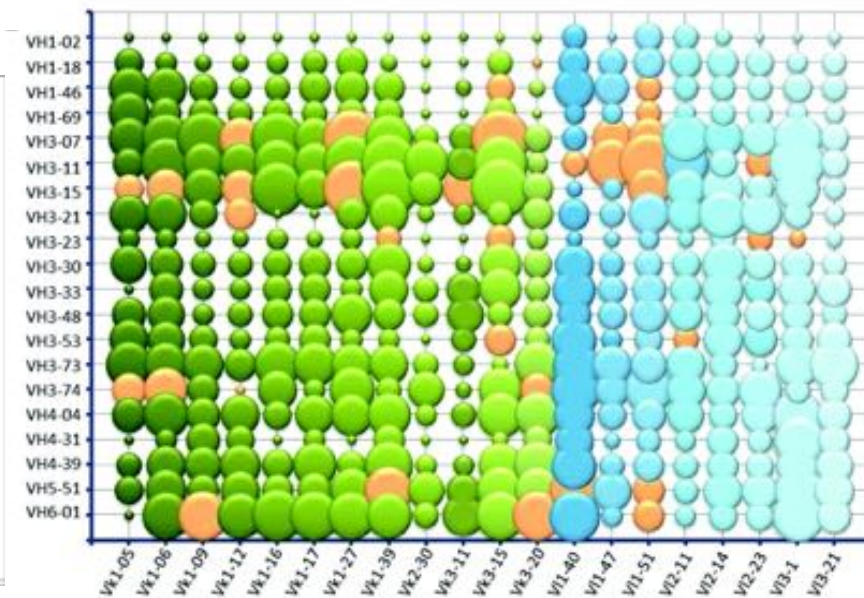
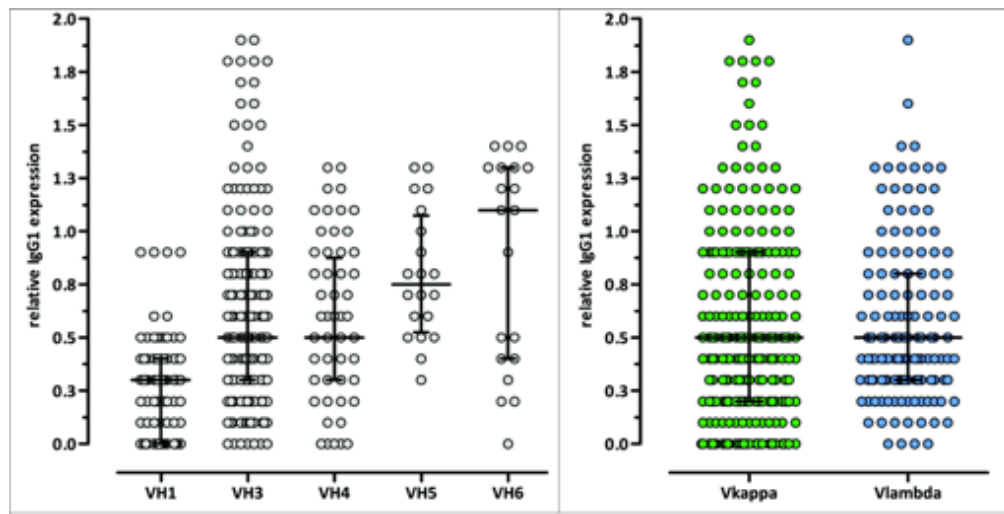
- Expression
  - Need to be able to express mAb in desired format at scale
    - For IgG > 1gm/L typically from CHO
    - Transient HEK expression does not always reflect ability to achieve high titer CHO expression

# Relative Fab expression differs by V-gene





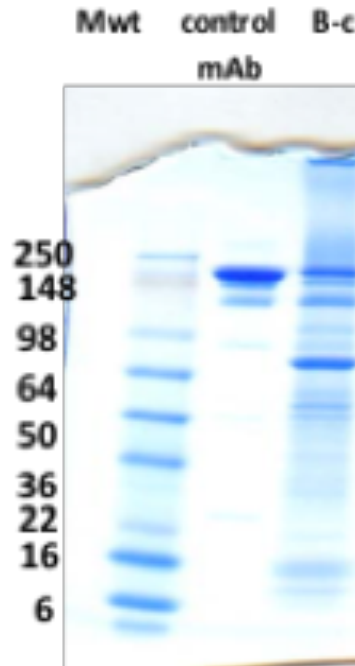
# Relative IgG expression differs by V-gene



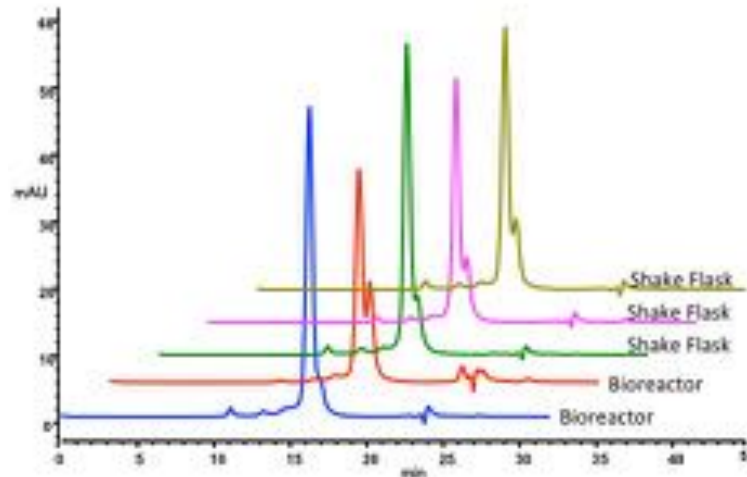
# Improving antibody expression by engineering



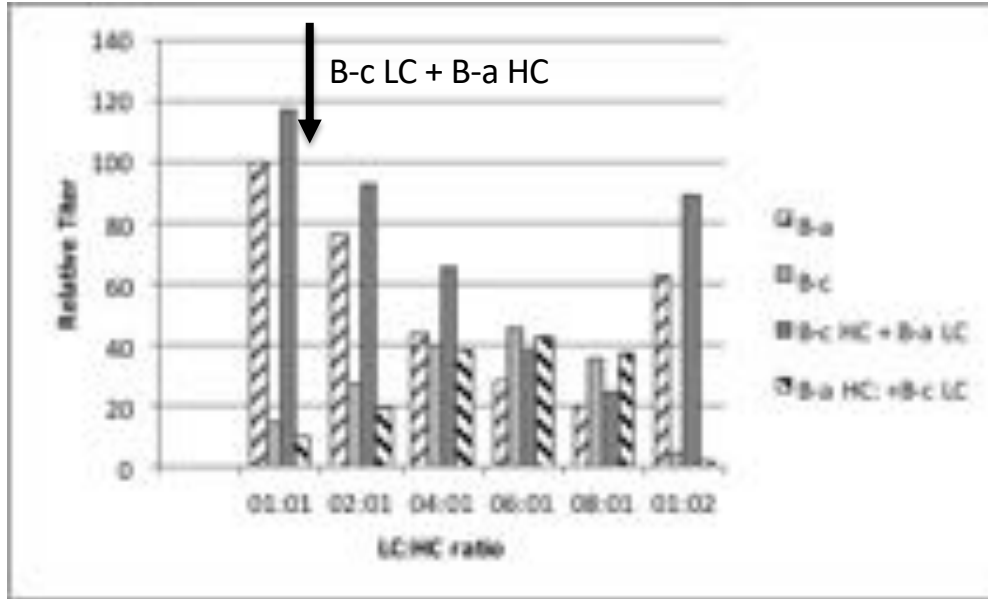
# Engineering to improve CHO expression and IgG quality



mAb XB23 = Mab B-c

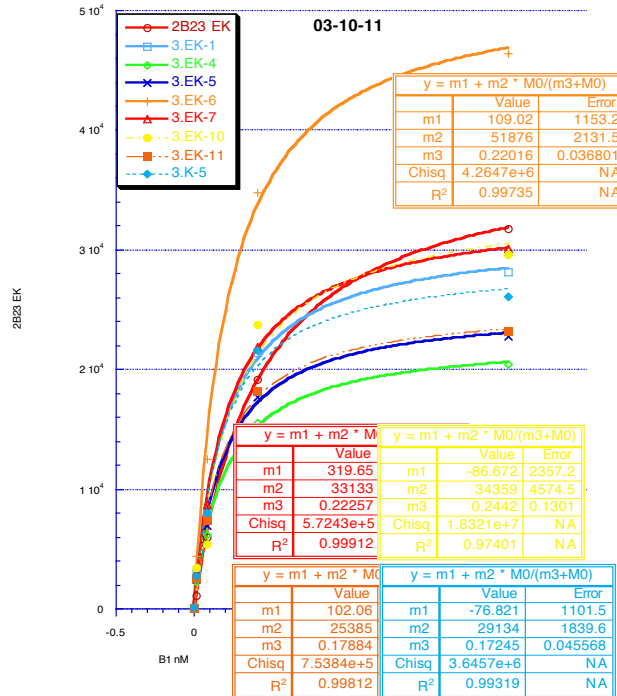


# Expression yield due to light chain



# Evolution of 2B23 to improve IgG expression in CHO limited by light chain

$y = m1 + m2 * M0$		$y = m1 + m2 * M$		$y = m1 + m2 * M$		$y = m1 + m2 * M0/(m3+M0)$	
	Value		Value		Value		Error
m1	-209.49	m1	187.45	m1	172.67	m1	98.389
m2	38515	m2	31167	m2	22442	m2	25114
m3	0.4036	m3	0.20551	m3	0.1988	m3	0.19019
Chisq	1.5599e+5	Chisq	1.4454e+6	Chisq	5.592e+5	Chisq	9.5847e+5
R <sup>2</sup>	0.99979	R <sup>2</sup>	0.99755	R <sup>2</sup>	0.99818	R <sup>2</sup>	0.99754
							NA



KD on BoNT/B1 at concentrations =  
2.0, 0.4, 0.08, 0.016 and 0.0 nM

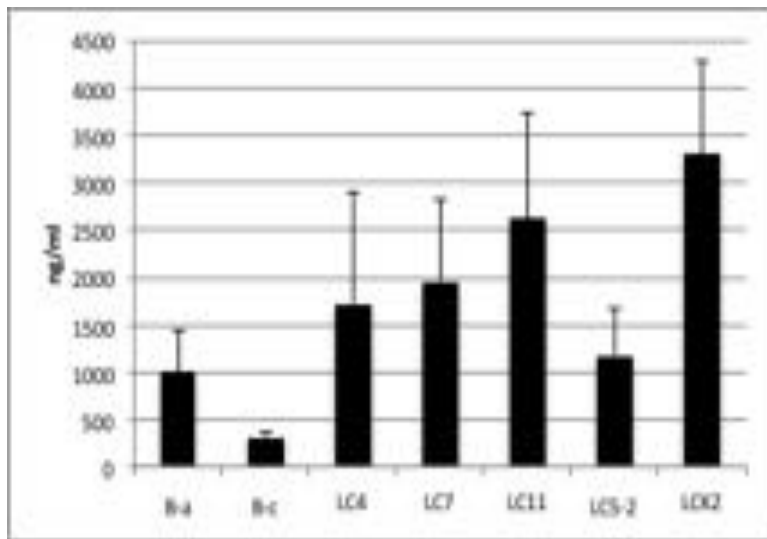
Clone	KD/B1 nM
2B23 EK	0.404
3.2B23EK-1	0.205
3.2B23EK-4	0.199
3.2B23EK-5	0.190
3.2B23EK-6	0.220
3.2B23EK-7	0.223
3.2B23EK-10	0.244
3.2B23EK-11	0.179
3.2B23K-5	0.172
2B23 wt	0.637

# IgG affinities of yeast displayed 2B23 mutants

Clone	Yeast KD	Kinexa KD (pM)
Wild type	0.637	37.7
EK4	0.199	0.077
EK7	0.223	2.73
EK11	0.179	13.4
EK5-2	0.172	4.99
K2	0.180	1.89
K11	0.158	2.9

All six much better behaved and with better expression

# All six mutants much better behaved and with better expression



Clone	Shake Flask	CE-SDS (%)		SEC-HPLC(%)		IEX-HPLC (%)		
	Titer (µg/ml)							
		IgG	HH <sup>a</sup>	Monomer/ Shoulder	HMW <sup>b</sup>	Acidic	Main	Basic
EK4-43	450	94.31	1.29	96.28/0	3.62	18.7	59.9	21.4
EK4-78	373	94.90	0.89	98.66/0	1.34	22.2	58.4	19.5
EK4-54	331	93.84	1.80	96.36/0	3.51	39.2	47.3	13.5
mAb B-c	50-160	75.20	20.70	71.94/19.45	5.54	ND <sup>c</sup>	ND	ND

# Antibody characterization

- Sequence
  - Undesirable sequence features
    - V-region glycosylation (coded NXS/T)
      - Germline encoded in some V-genes; both framework and CDRs
      - May be preferentially selected using yeast display
    - Cysteines
      - Can usually mutate to Ser without affecting binding
    - Solvent accessible methionine
      - Deamidation
    - Solvent accessible aspartate
      - Oxidation

# Antibody characterization

- Specificity
  - Measure binding on panel of relevant and irrelevant antigens
    - For therapeutic mAbs useful for tox. studies to have cross reactive antibody (murine and human)
  - Serum half-life in rodent can reflect cross reactivity (or antigen sink)

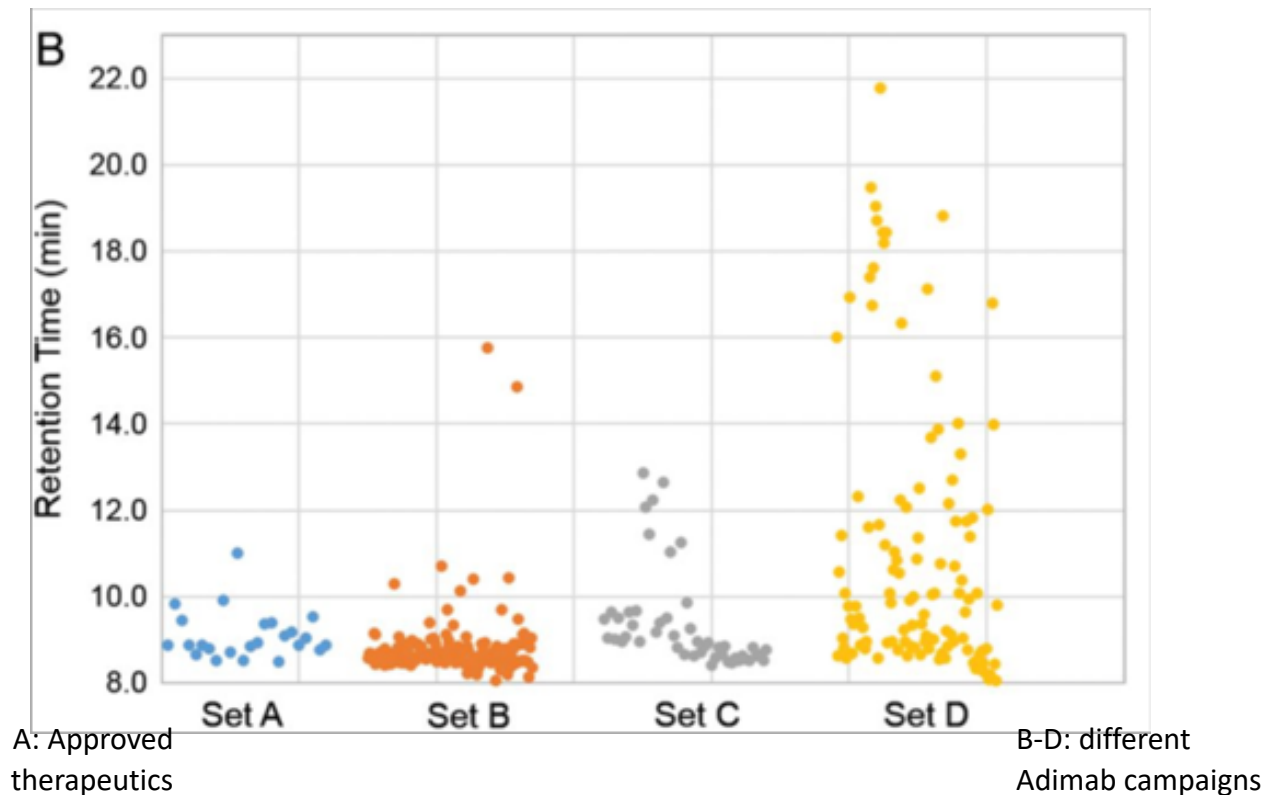
		Ag1	Ag2	Ag3	Ag4	Ag5	Ag6	Ag7	Ag8	
hyb 5	200	2,3	25,1	0,9	1,0	3,9	1,1	15,8	44,9	recAb stronger than hyb mAb, but both have strong polyreactivity
	20	0,5	18,5	0,8	0,8	1,1	0,8	1,1	1,4	
recAb 5A	5 to 50	0,6	8,5	2,3	3,3	55,1	9,8	71,9	274,8	
recAb 5B	5 to 50	0,3	0,9	1,3	1,6	1,4	0,6	0,7	3,2	

# Polyspecificity

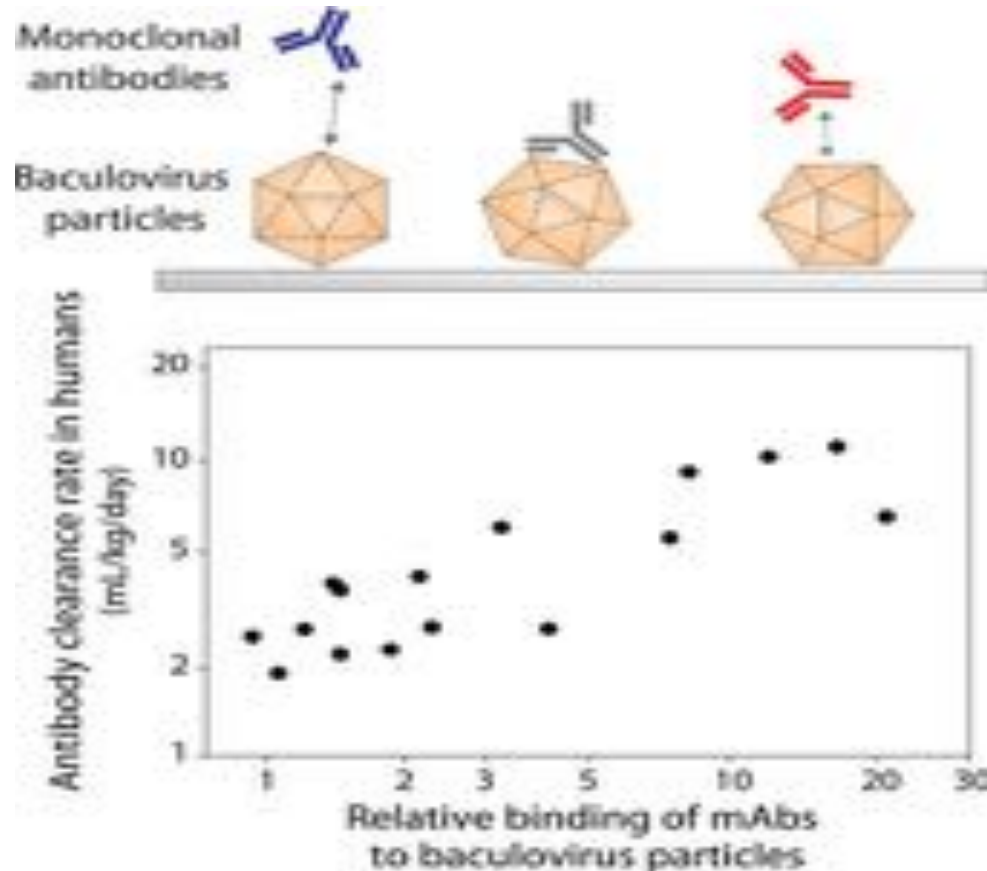
- Can be classified into two types
  - Self specificity: Aggregation, which can be quantified by
    - Cross interaction chromatography (CIC)
      - Polyclonal or monoclonal antibody column
      - Run mAbs under study over column and measure retention times
      - Found to correlate with solubility
    - AC-SINS
      - Gold particles with capture reagent (anti-FC e.g.)
      - Measure plasmon change as particles closer if self aggregation
  - Polyspecificity for other antigens
    - Can be quantitated using 'polyspecificity reagents'
      - Baculovirus lysates
      - Biotinylated CHO or mammalian membrane lysates



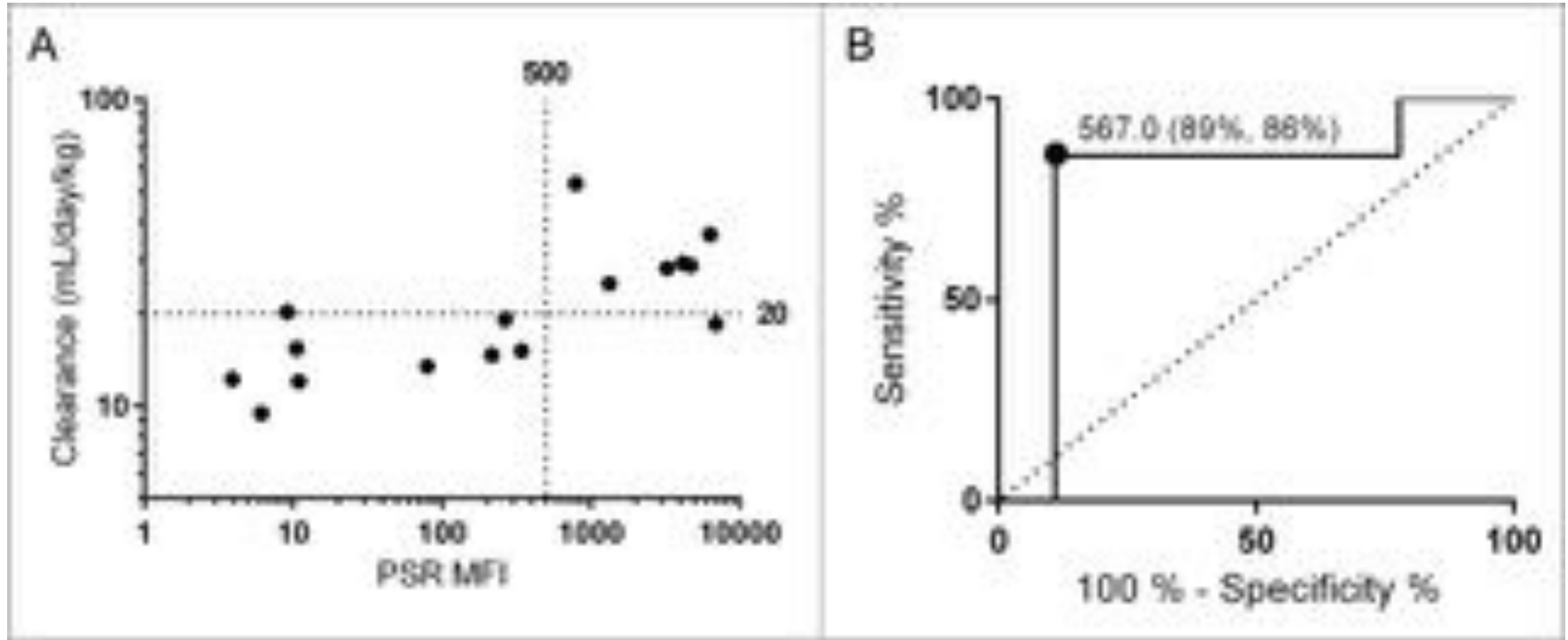
# CIC of approved drugs and library mAbs



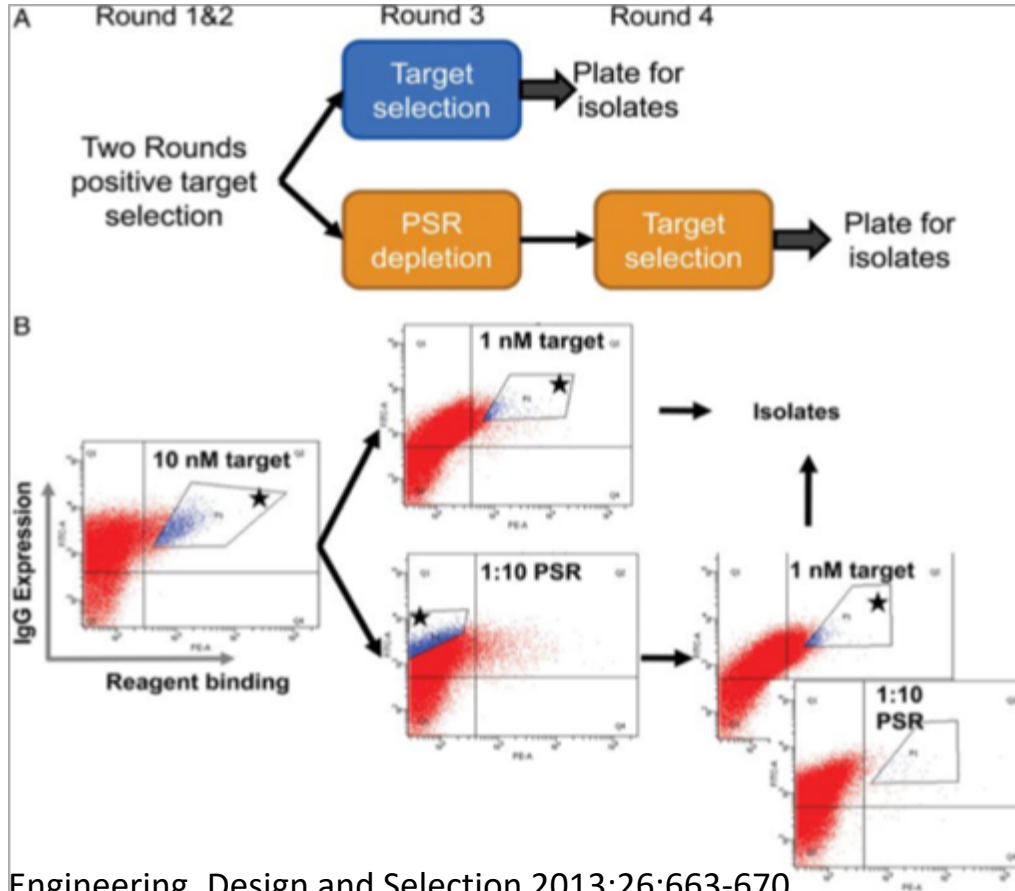
# Polyspecificity correlates with reduced serum half life



# Polyspecificity correlates with reduced serum half life

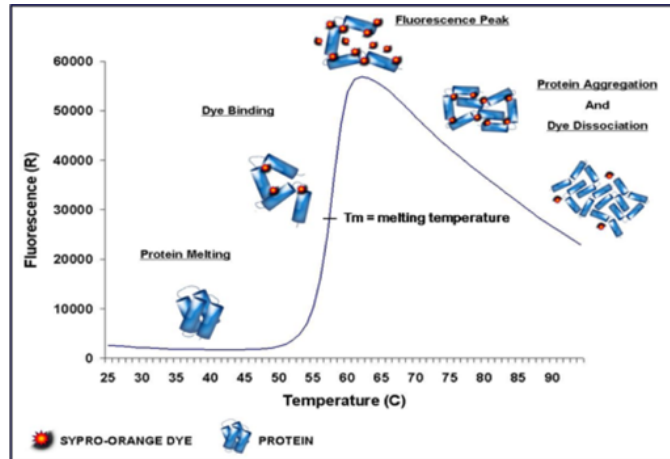


# Selecting to remove polyspecificity

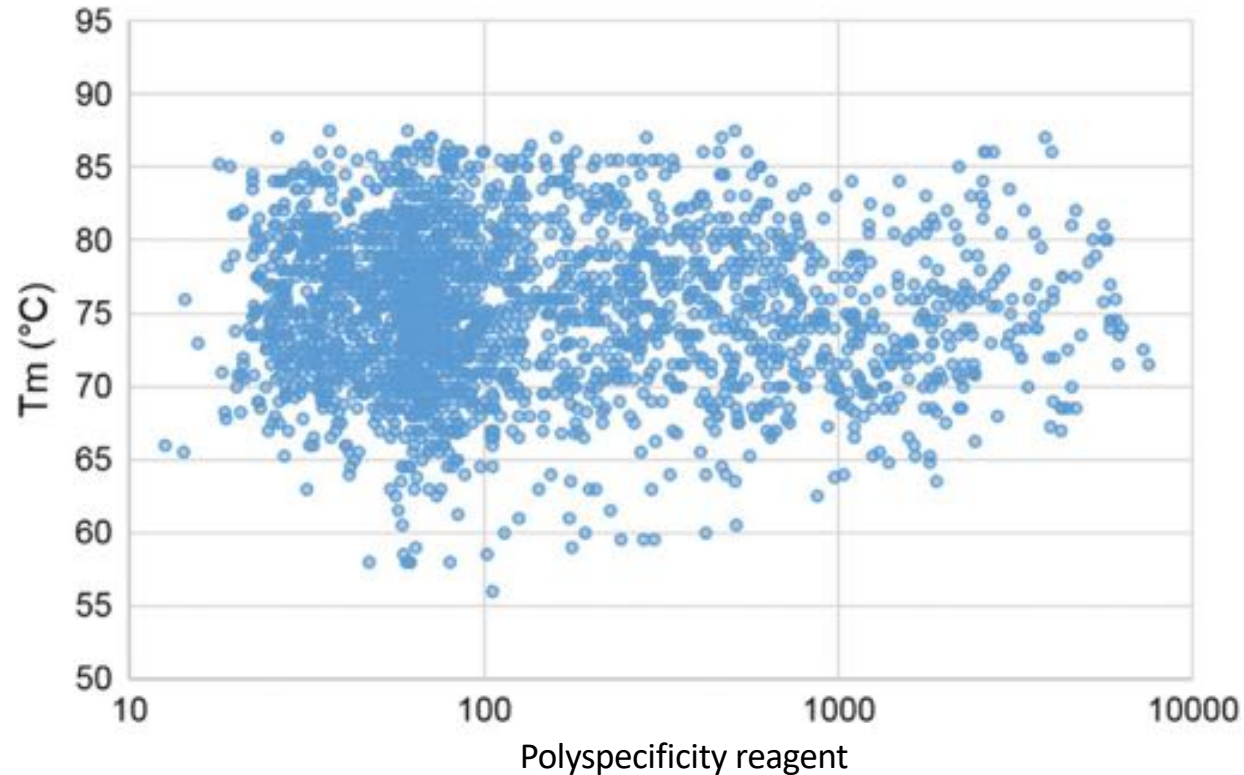


# Antibody characterization

- Stability
  - Reflected in  $T_m$  of the variable region (usually Fab)
  - Varies significantly as a function of sequence
  - Can be measured using:
    - DSC
    - SYPRO Orange



# Some assays have no cross correlation



# Assessment of 137 clinical antibodies

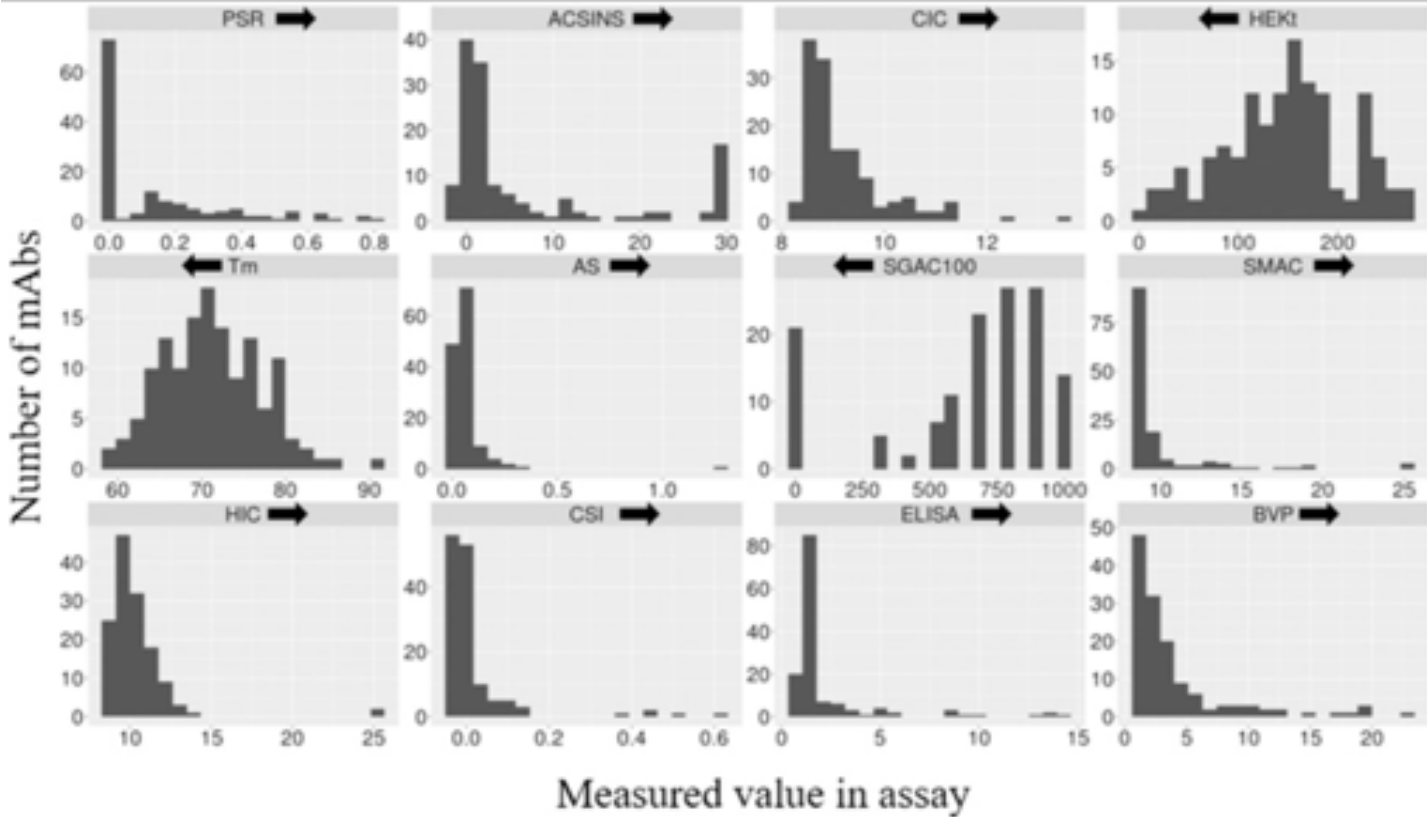
- 48 from approved antibodies
- 42 phase 2/3 or 3
- 47 phase 2
  - 124 Kappa, 13 lambda
  - 58 fully human
  - 67 humanized
  - 12 at least one non-human V region
- All recloned with IgG1 Fc
- Expressed in HEK

# Tests performed

- Antibody self-interaction
  - AC-SINS: affinity-capture self-interaction nanoparticle spectroscopy
  - CSI-BLI: clone self-interaction by bio-layer interferometry
- Cross interactions
  - PSR: poly-specificity reagent binding (cell membrane)
  - BVP: baculovirus particle
  - CIC: cross-interaction chromatography
  - ELISA with a panel of commonly used antigens
- HEKt: Expression titer in HEK cells
- Tm: Melting temperature of Fab
- HIC: Hydrophobic interaction chromatography
- SGAC-100: (salt-gradient affinity-capture self-interaction nano- particle spectroscopy)
- SMAC: Standup monolayer adsorption chromatography
- Monomeric species assessment
  - AS: Size-exclusion chromatography in the context of accelerated stability

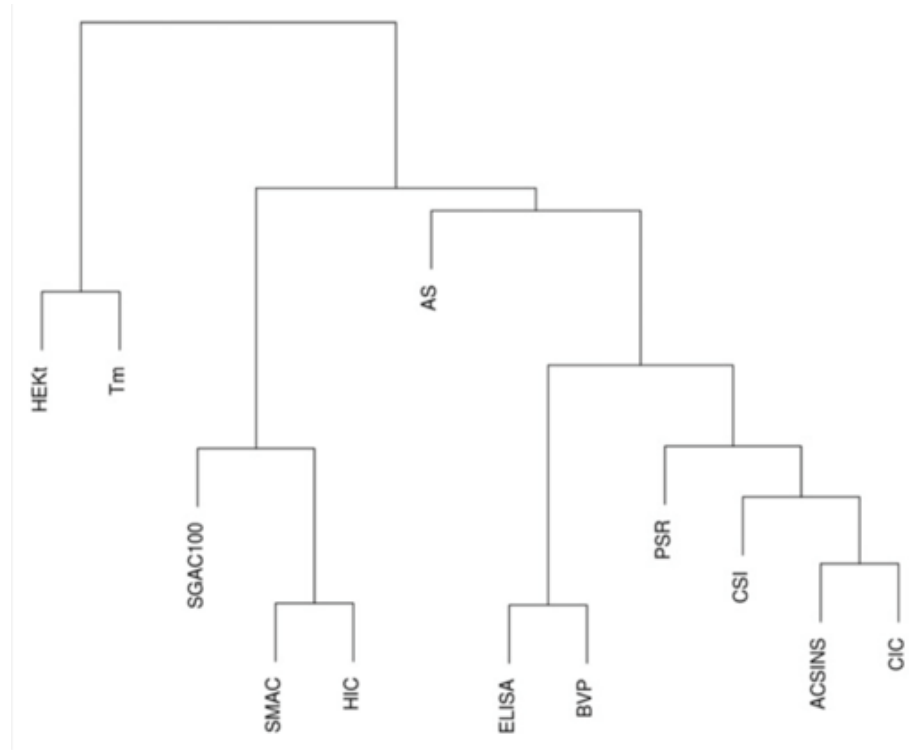


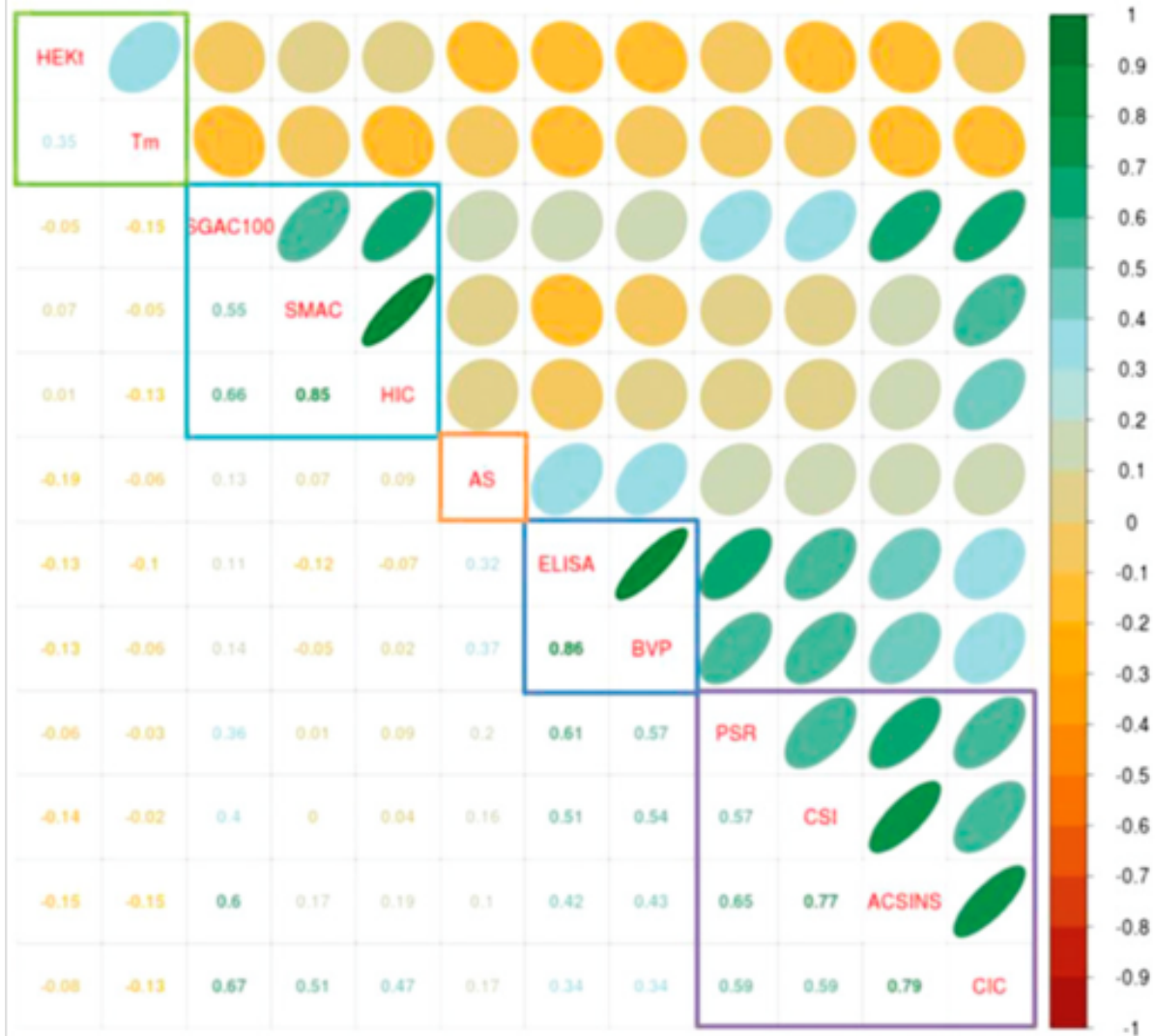
# Long tails



Arrows indicates direction of worse developability

# Hierarchical clustering of biophysical properties



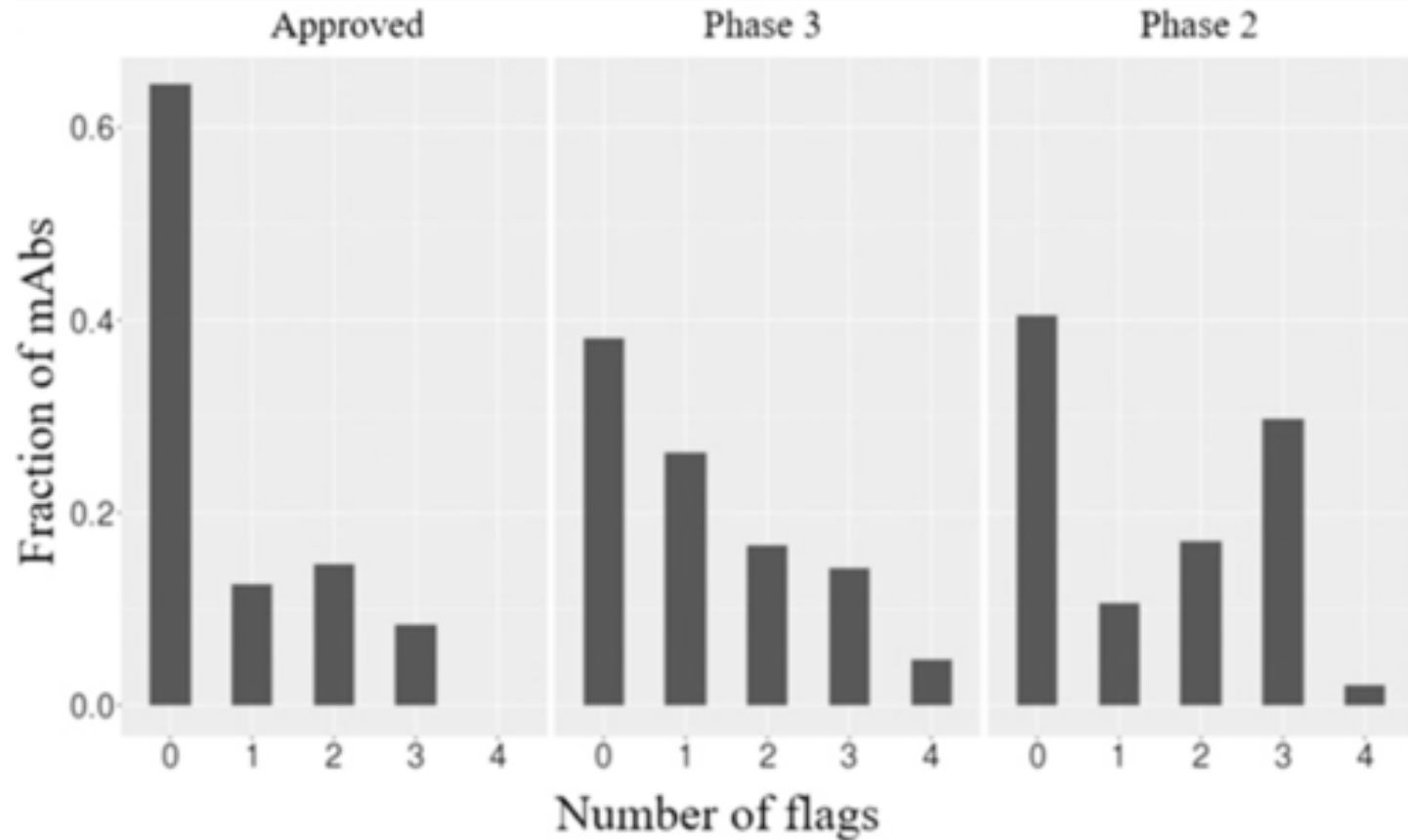


# Concept of red flags

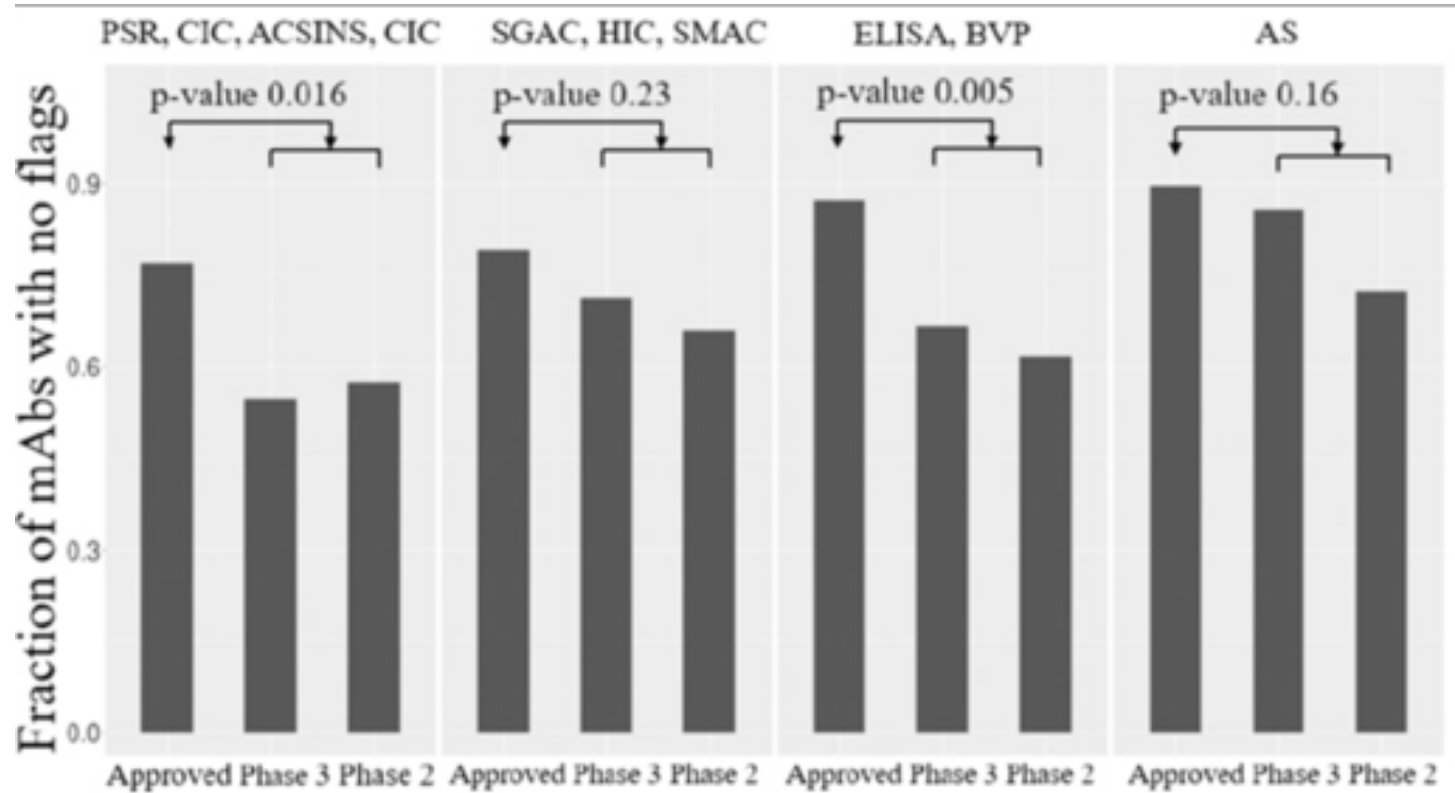
Group	Assay	Worst 10% threshold	Units (flag)
Group 1	PSR	$0.27 \pm 0.06$	None (>)
	ACSINS	$11.8 \pm 6.2$	Nanometers (wavelength change) (>)
	CSI	$0.01 \pm 0.02$	BLI response units (>)
	CIC	$10.1 \pm 0.5$	Retention time (min) (>)
Group 2	HIC	$11.7 \pm 0.6$	Retention time (min) (>)
	SMAC	$12.8 \pm 1.2$	Retention time (min) (>)
	SGAC-SINS	$370 \pm 133$	Salt concentration (mM) (<)
Group 3	BVP	$4.3 \pm 2.2$	Fold-over-background (>)
	ELISA	$1.9 \pm 1.0$	Fold-over-background (>)
Group 4	AS	$0.08 \pm 0.03$	Monomer percentage loss per day (>)

- 48 approved antibodies
  - For each measure a “red flag” corresponds to a value in the worst 10%
- Document the red flags for antibodies at different stages of development

# Red flags through development



# Red flags by assay



# Cross clustering of all 137 antibodies

