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High-throughput synthesis and specificity characterization of nativelypaired antibodies using oPool⁺ display

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ABSTRACT

Antibody discovery is crucial for developing therapeutics and vaccines as well as

understanding adaptive immunity. However, the lack of approaches to synthesize antibodies

with defined sequences in a high-throughput manner represents a major bottleneck in

antibody discovery. Here, we presented oPool$^+$ display, a high-throughput cell-free platform

that combined oligo pool synthesis and mRNA display to rapidly construct and characterize

many natively paired antibodies in parallel. As a proof-of-concept, we applied oPool$^+$ display

to probe the binding specificity of >300 uncommon influenza hemagglutinin (HA) antibodies

against 9 HA variants through 16 different screens. Over 5,000 binding tests were performed

in 3-5 days with further scaling potential. Follow-up structural analysis of two HA stem

antibodies revealed the previously unknown versatility of IGHD3-3 gene segment in

recognizing the HA stem. Overall, this study established an experimental platform that not

only accelerate antibody characterization, but also enable unbiased discovery of antibody

molecular signatures.

Keywords: High-throughput screening, influenza, hemagglutinin, B-cell receptors, antibody,

broadly neutralizing, oligo pools, mRNA display, cryo-EM

 INTRODUCTION

Antibodies are central to the immune system for protection against pathogen infection.

Therefore, identification of antibodies that target pathogens of interest is key to the

understanding of adaptive immunity as well as the development of effective therapeutics and

vaccines. In recent years, advances in single-cell B-cell receptor sequencing (scBCR-seq)

have greatly improved the capacity to discover novel antibodies[1]. Thousands of natively

paired antibody sequences can be obtained from a single scBCR-seq experiment. By

contrast, downstream characterization of these antibody sequences remains costly, labor

intensive, and time consuming, involving cloning, expression, purification, and testing the

binding activities of different antibodies individually. At the same time, protein display

technologies offer a high-throughput solution for characterizing antibody binding activity[2],

with antibody library construction being an essential first step. Methods for constructing

antibody libraries with random heavy-light chain pairing from B cell repertoires are well-

established[3,4]. However, there is a lack of approaches to synthesize custom-made antibody

libraries with precise heavy-light chain pairing from a defined list of antibody sequences.

This technical barrier has restricted the application of protein display technologies in

antibody research, including large-scale characterization of previously discovered antibodies.

Hemagglutinin (HA) is the major antigen of influenza A and B viruses. Influenza A HA is

further divided into two groups with a total of 19 antigenic subtypes (H1-H19). Group 1 HA

includes H1, H2, H5, H6, H8, H9, H11, H12, H13, H16, H17, H18, and H19, whereas group

2 HA includes H3, H4, H7, H10, H14, and H15. HA is a homotrimeric glycoprotein consisting

of a hypervariable globular head domain atop a conserved stem domain[5,6]. The functions of

HA are critical for viral entry. The globular head domain engages the sialylated receptor,

whereas the stem domain possesses the membrane fusion machinery. In the past two

decades, many human antibodies to the HA stem have been discovered and characterized[7–

11]. In contrast to HA head antibodies, which are usually strain-specific, HA stem antibodies

often cross-neutralize multiple influenza subtypes. Several recurring sequence features have

been observed among HA antibodies isolated from different individuals, such as IGHV1-69,

IGHV1-18, IGHD6-1, IGHD3-9 for stem antibodies, and IGHV2-70 and IGHD4-17 for head

antibodies[7,11–15]. However, many HA antibodies do not contain any known recurring

sequence features, suggesting there are additional features yet to be discovered.

Discovering the recurring sequence features of HA antibodies is critical for the molecular

understanding of antibody responses at the population level, which will in turn benefit the

development of universal influenza vaccines.

In this study, we developed oPool⁺ display, a rapid and cost-effective cell-free platform that

combined oligo pool synthesis with mRNA display to assemble and screen natively paired

antibodies in a highly parallel manner. As a proof-of-concept, we first synthesized a library of

325 natively paired HA antibodies with uncommon germline gene usages, then

characterized their binding activity to seven different HAs from influenza A and B viruses as

well as an H1 stem construct and an H3 stem construct. We also carried out competition

screens against a known HA stem antibody for binding to the same set of HAs, allowing

epitope inference. Our screening showed that 114 of the 325 antibodies bound to at least

one of the nine HA screened, 45 of which were further identified as HA stem antibody

candidates. Extensive experimental validations confirmed the robust performance oPool⁺

display. We then demonstrated oPool⁺ display's potential in discovering antibody sequence

features through structural and functional characterizations of 16.ND.92 and AG11-2F01,

two group 1 stem antibody enriched in the screen. 16.ND.92 and AG11-2F01 exhibited

distinct binding modes of IGHD3-3 to HA stem, yet both antibodies were broadly reactive

and protected against lethal influenza challenge *in vivo*. This observation substantiated that

IGHD3-3 is a recurring sequence feature of HA stem antibodies and demonstrated its

versatility in binding to HA stem.

RESULTS

High throughput assembly of natively paired antibody library via oligo pools

We previously curated a dataset containing 5,561 human monoclonal HA antibodies, 1,082

(19.5%) of which are known to bind to either the head domain or the stem domain[16]. Of the

remaining 4,479 (80.5%) HA antibodies which lack epitope information, 292 have complete

heavy chain variable (V_H) and light chain variable (V_L) sequences available and are not

encoded by well-characterized sequence features of HA stem antibodies, namely IGHV1-69,

IGHV1-18, IGHV6-1, and IGHD3-9[7,12–14] (**Figure S1A and Table S1**). These 292 HA

antibodies were included in the synthesis of our natively paired antibody library. In addition,

three known stem antibodies, namely 31.a.55, AG11-2F01, and 042-100809-2F04[7,17], as

well as 30 known HA head antibodies[6,15,18–25] were included as controls, bringing the total

library size to 325 antibodies **(Figure 1A)**.

To synthesize the natively paired antibody library in a high-throughput manner, we aimed to

leverage recent advances in oligo pool synthesis. The maximum length of each oligo in

commercial oligo pool synthesis is around 300 to 350 nucleotides. By contrast, the length of

a single-chain variable fragment (scFv), which is the smallest format of a human antibody, is

around 800 to 900 nucleotides. As a result, each given scFv sequence was split into 4 oligos

with overlaps at the diverse complementary-determining regions (CDRs), namely the CDRs

H1, H3, and L3 (**Figure 1B-C and Table S2**). We then performed codon randomization to

ensure that the overlaps among oligos for the same scFv are unique at the nucleic acid level.

This would help prevent mis-annealing between oligos from different scFvs, especially if they

shared similar amino acid sequences (**Figure 1B, Material and Methods**). Through an one-

pot overlap PCR, full-length scFv sequences could then be generated with the intended

native V_H and V_L pairing. Subsequently, this strategy was applied to design the oligo pools

for our library of 325 antibodies (**Figure 1C-F, Figure S1B-C, and Table S2**).

The length of the assembled product was consistent with that of full-length scFvs (**Figure

1D**). To thoroughly evaluate the effectiveness of our synthesis strategy, we then performed

several assembly PCRs with the starting oligos of 25, 75, 100, 125, 150, and 200 scFvs

each in a single tube (**Figure 1E-F and Figure S2**). PacBio sequencing revealed the high

reproducibility of the one-pot PCR assembly across the board, with a Pearson correlation

coefficient of 0.95 even at 200 scFvs per PCR (**Figure 1E**). The one-pot PCR assembly

strategy also achieved high coverage of the targeted antibodies, with only a subtle drop from

100% to 90% as the complexity of the PCR increased from 25 to 200 scFvs (**Figure 1F**). For

our final library of all 325 scFvs, a Pearson correlation coefficient of 0.83 was observed

between replicates, with a coverage of 322 of 325 (99.1%) natively paired antibodies

(**Figure S3**). While we opted to assemble this antibody library through 13 PCRs with 25

scFvs each tube, our results demonstrated the potential to further increase the throughput of

our antibody library synthesis strategy by at least one orders of magnitude.

Rapid specificity characterization of the natively paired antibodies by mRNA display

To characterize antibody specificity from our natively paired scFv library, we utilized mRNA

display[26–28], a well-established cell-free screening approach that allows rapid screening for

protein binders. Briefly, each scFv was covalently linked to the RNA molecule that encoded it,

thus providing a phenotype-genotype linkage (**Figure S4A, Material and Methods**). The

mRNA-displayed antibody library was then selected against seven HAs from different

influenza A subtypes and influenza B strains, namely H1N1 A/Solomon Island/3/06 (H1/SI06),

H1N1 A/Michigan/45/2015 (H1/MI15), H3N2 A/Singapore/INFIMH-16-0019/2016 (H3/SP16),

H5N1 A/ Qinghai/1A/2005 (H5/QH05), H7N9 A/Shanghai/2/2013 (H7/SH13),

B/Phuket/3073/2013 (B/Phu13), and B/Lee/1940 (B/Lee40). Selections were also performed

against two HA stem domain constructs that were designed based on H1N1

A/Brisbane/59/2007 HA and H3N2 A/Finland/486/2004 HA, respectively[29,30] (**Figure 2 and**

Figure S4). After one round of selection, the pre- and post-selection libraries were then

analyzed by PacBio sequencing to quantify the enrichment of each scFv (**Table S3**).

Pearson correlation coefficients ranging from 0.58 to 0.86 were observed between biological

replicates (**Figure S5**), demonstrating the reproducibility of the selections. In total, 114 of the

325 scFvs were identified to target one of the HAs screened, with 52 targeting more than

one HA and 11 targeting more than two HAs (**Table S4**). All stem antibody controls were

enriched in at least one screens, while only 17 of the 30 head antibody controls were

enriched, likely due to the considerably limited binding breadth of head antibodies. Moreover,

the stem antibody controls were highly enriched in the selections against the HA stem

domain constructs, whereas the head antibody controls were not, further validating that

selection took place.

We also performed seven competition screens against CR9114[10], a broadly neutralizing HA

stem antibody, for binding to H1/SI06, H1/MI15, H3/SP16, H5/QH05, H7/SH13, and B/Phu13,

and B/Lee40 (**Figure 2 and Figure S6**). Competition screens were performed using the

same protocol as the mRNA display selections described above, except that CR9114 was

pre-bound to the HAs. While the CR9114 competition screen for H3/SP16 did not yield

consistent PCR bands post-selection, all six other screens resulted in reproducible bands

and were analyzed by PacBio sequencing. Of these six screens, five had Pearson

correlation coefficients of >0.7 between replicates (**Figure S7**), demonstrating their

reproducibility. The results of our competition screening were in agreement with previous

studies. For example, two of our stem antibody controls, AG11-2F01 and 31.a.55, competed

with CR9114 in our screens, which is consistent with previous studies of these two

antibodies[7,17]. Additionally, 15 of the 17 (88%) HA head antibody controls targeting at least

one HA in our screens did not compete with CR9114, further supporting the effectiveness of

the competition screen (**Table S4**). Together, we identified five antibody candidate targeting

group 1 HA stem, 12 targeting group 2 HA stem, as well as 28 targeting influenza B HA stem

(**Figure S5 and Table S4**). Of note, one of the H3 stem antibody candidates, AG2-G02, was

concurrently identified by a machine learning approach and experimentally confirmed in

another study of ours[16].

oPool+ display demonstrates robust performance in specificity characterization

To systematically evaluate the performance of oPool$^+$ display, we used both biolayer

interferometry (BLI) and ELISA to validate the binding activities of selected antibodies

(**Figure 3**). In brief, 25 antibodies were selected, recombinantly expressed and purified in

fragment antigen-binding (Fab) and IgG formats. Their binding activities were then tested

against all nine HAs used in our screens (**Figure 3A-B, Figure S8**). This validation

experiment substantiated the robust performance of oPool$^+$ display. A true positive rate of

80.4% (41/51) and a true negative rate of 95.4% (166/174) was observed in BLI validation

with Fabs, while a true positive rate of 71.7% (43/60) and a true negative rate of 96.4%

(159/165) was observed in ELISA validation with IgG (**Figure 3C**). Of note, both

experimental validations indicated that the majority of the false positive and false negative

results (11/18 for BLI, 14/23 for ELISA) were from three screens (H3 stem, H1/SI06, and

H1/MI15). To examine the influences of different antibody formats on binding, we determined

the dissociation constant (K_D) of three H1 stem antibodies and six H3 stem antibodies that

were enriched in our screen in both Fab and scFv formats (**Figure 3D, Figure S9 and S10**).

All nine antibodies retained binding in both formats, with no apparent correlation between

the K_D values. However, some of the false negatives could still be due to weakened binding

of the antibody in scFv format during the screens.

We then further assessed the performance of our CR9114 competition screens using 16 of

the 25 antibodies validated above (**Figure 4A-B**). To quantify the competition, we first

defined the CR9114 competition index as the log fold change of enrichments with versus

without the presence of CR9114 during screen (**Table S4, Figure S11, Materials and**

Methods). A higher CR9114 competition index would indicate overlapping epitopes between

the scFv and CR9114, while a lower CR9114 competition index would indicate opposite

(**Figure 4A**). Experimental validation of these competition indices was then performed using

BLI, where the ratio of binding responses to HA with and without CR9114 pre-bound was

quantified (**Materials and Methods**). Pearson correlation of 0.66 was observed between the

competition indices and the validation results (**Figure 4B, Figure S12, and Table S5**),

confirming the reliability of our CR9114 competition screens. Together, our results showed

that oPool[+] display enabled rapid and accurate specificity characterization of natively paired

antibodies.

AG11-2F01 and 16.ND.92 have similar sequence features but distinct binding modes

One of the H1 stem antibodies identified from our screen was 16.ND.92, which was

originally isolated from a young individual in an H5N1 influenza vaccine trial[7]. 16.ND.92 was

encoded by IGHV3-74/IGHD3-3/IGKV1-5 (**Table S4**). Coincidentally, both IGHD3-3 and

IGKV1-5 were utilized by AG11-2F01, which was one of the two positive controls against H1

stem in our screen (**Figure 2 and Figure S5**). Moreover, 16.ND.92 and AG11-2F01 shared a

similar FG[V/L] motif encoded by the reading frame +3 of IGHD3-3 (**Figure S13**). This

observation led us to hypothesize that 16.ND.92 and AG11-2F01 engaged the HA stem via

similar binding modes. Consequently, we determined the cryo-EM structures of H1N1

A/Solomon Islands/03/2006 (H1/SI06) HA in complex with AG11-2F01 and 16.ND.92 to

resolutions of 2.89 Å and 2.82 Å, respectively (**Figure 5A-E and Table S6**). Contrary to our

hypothesis, the cryo-EM structures revealed very different binding modes between the two

antibodies. While AG11-2F01 bound to HA stem horizontally, 16.ND.92 had a downward

approaching angle towards HA (**Figure 5A**). Relatedly, the epitope of 16.ND.92 shifted slight

upward compared to that of AG11-2F01 (**Figure 5B**).

Although both 16.ND.92 and AG11-2F01 were encoded by IGKV1-5, their light chains

interacted with the HA stem differently. For example, V_L S30 of AG11-2F01 H-bonded with

HA2 Q38, whereas that of 16.ND.92 H-bonded with HA1 K32 (**Figure 5C**). Similarly, despite

sharing an FG[V/L] motif in their IGHD3-3-encoded regions, 16.ND.92 and AG11-2F01 used

this motif to interact with different parts of the HA stem (**Figure 5D**). For the FGL motif in

AG11-2F01, V_H F100 inserted into a hydrophobic pocket in the HA stem centering at HA2

I48, whereas V_H L100b inserted into a lower pocket centering at HA2 W21. By contrast, this

lower pocket was occupied by the V_H F100a of the FGV motif in 16.ND.92. The paratope of

16.ND.92 also involved IGHD3-3-encoded V_H V100, I100e, and I100f, allowing its CDR H3

to bind to upper pockets in the HA stem that were not engaged by AG11-2F01 (**Figure 5D**).

Together, our structural analyses showed that AG11-2F01 and 16.ND.92 formed distinct

molecular interactions with HA stem.

16.ND.92 utilizes IGHD3-3 in a unique manner for binding to HA stem

Previous studies have determined the structures of several HA stem antibodies with an

FG[V/L/I] motif in the CDR H3 that was encoded by reading frame +3 of IGHD3-3, including

MEDI8852, 56.a.09, 54-1G05, 39.29, PN-SIA28, and 429 B01[7,9,31–34]. These six HA stem

antibodies used either IGHV6-1 or IGHV3-30, unlike AG11-2F01 and 16.ND.92, which used

IGHV4-38-2 and IGHV3-74, respectively. Nevertheless, the CDR H3 conformation of AG11-

2F01 resembled that of MEDI8852, 56.a.09, 54-1G05, 39.29, PN-SIA28, and 429 B01

(**Figure 5E**). Moreover, the IGHD3-3-encoded FG[V/L/I] motifs of these seven antibodies

bound to the HA stem in a similar fashion (**Figure 5E**). In comparison, the CDR H3

conformation of 16.ND.92 was different due to more extensive involvement of IGHD3-3 in

binding (**Figure 5D-E**).

The unique usage of IGHD3-3 for binding enables 16.ND.92 V_H to interact with the HA stem

exclusively through CDR H3, whereas the V_H paratopes of other IGHD3-3 HA stem

antibodies involved non-CDR H3 regions (**Figure 5F and Table S7**). Similarly, IGHD3-3

accounted for 98.6% of the buried surface area of the 16.ND.92 V_H paratope, but 38% to 63%

of the V_H paratopes of other IGHD3-3 HA stem antibodies (**Figure 5G and Table S7**). These

observations not only substantiated that reading frame +3 of IGHD3-3 was a recurring

sequence feature of HA stem antibodies, but also demonstrated that it could pair with

diverse IGHV genes and interact with HA stem via different binding modes.

AG11-2F01 and 16.ND.92 are neutralizing antibodies with *in vivo* protection activity

Given the different binding modes of AG11-2F01 and 16.ND.92, we further aimed to

compare their binding breath, *in vitro* neutralization, and *in vivo* protection activity. ELISA

showed that both AG11-2F01 and 16.ND.92 bound to all H1 and H5 HAs tested (**Figure 6A**

and Figure S14), Microneutralization assay against six H1N1 strains further revealed their

neutralizing activity (**Figure 6B**). Both AG11-2F01 and 16.ND.92 also protected mice against

a lethal challenge of H1N1 A/Puerto Rico/8/1934 (PR8), based on the weight loss profiles

(**Figure 6C-D**), survival analyses (**Figure 6E-F**), and lung viral titers at day 3 post-infection

(**Figure 6G-H**). Nonetheless, our results indicated that the *in vivo* therapeutic protection

activity of 16.ND.92 was stronger than AG11-2F01. While only 20% (1/5) of the mice

therapeutically treated with AG11-2F01 survived (**Figure 6E**), 80% (4/5) of the mice

therapeutically treated with 16.ND.92 survived (**Figure 6F**). Additionally, at day 3 post-

infection, lung viral titers of mice therapeutically treated with 16.ND.92 were ~15-fold lower

than those treated with AG11-2F01 (**Figure 6G-H**). Notably, 16.ND.92 had comparable, if not

weaker, *in vitro* neutralizing activity than AG11-2F01 against PR8 (**Figure 6B**). Consequently,

the stronger *in vivo* protection activity of 16.ND.92 against PR8 may at least be partly

attributed to its more downward approaching angle to the HA stem (**Figure 5A**), which could

help position the Fc region closer to effector cells.

DISCUSSION

Antibody discovery has led to significant advancements on many fronts, including antibody-

based therapeutics as well as vaccine designs[11,35–38]. Discovery of natively paired antibody

sequences has been hugely accelerated by scBCR-seq in the past few years[1]. However,

going from sequence information to specificity characterization remains a major bottleneck in

antibody discovery. In this study, we presented oPool[+] display, an experimental platform that

allows specificity characterization of antibodies with defined sequences in a highly parallel

fashion. Importantly, oPool[+] display was more cost-efficient (~$30 per antibody) and faster

(~3-5 days) than the conventional methods that require cloning and recombinant expression

of individual antibodies (~$200-350 per antibody, weeks to months) (**Table S8**). As a proof-

of-concept, we applied oPool⁺ display to delineate the binding specificity of hundreds of HA

antibodies that were left uncharacterized in the literature. Follow-up analysis of AG11-2F01

and 16.ND.92 further revealed the versatility of IGHD3-3 in targeting the HA stem.

A key feature of oPool⁺ display is its relatively simple protocol. A previous study has shown

that the throughput for screening antibodies with defined sequences can be increased by

using liquid handlers to express individual antibodies one by one[39]. In comparison, oPool⁺

display uses a near one-pot strategy for antibody library synthesis and screening. As

suggested by our results, one 96-well plate PCR can allow rapid assembly of library up to

~20,000 natively paired antibodies. With current display technologies, such as mRNA display,

screening of the library against 10 to 20 antigens can be done by one person in hours.

Moreover, it only requires standard benchtop equipment commonly found in a regular

molecular biology lab. In addition, the constructed library can be stored long-term as DNA for

future use when new antigens of interest emerge, such as novel HA variants or subtypes.

The library can also be expanded by merging with additional oligo pools when new panels of

antibodies are discovered. Therefore, oPool⁺ display not only bridges the gap between

scBCR-seq and protein display technologies through massively parallel reconstruction of

sequenced antibodies, but also provide more flexibility of the current antibody discovery

pipelines. After the natively paired antibody sequences are obtained from scBCR-seq,

oPool⁺ display can be applied to validate and characterize the specificity of a large panel of

antibody candidates at any time. The synergy between oPool⁺ display and scBCR-seq can

streamline the transition from antibody discovery to antibody characterization.

Previous studies have shown that IGHV6-1 and IGHV3-30 HA stem antibodies often utilize

IGHD3-3-encoded FG[V/L/I] motif for binding to HA stem[7,9,31–34]. As demonstrated by our

work here, IGHD3-3-encoded FG[V/L/I] motif can also pair with other IGHV genes to target

HA stem, substantiating that it is an IGHV-independent recurring sequence feature of HA

stem antibodies. Our results further revealed that IGHD3-3 can engage the HA stem via

different binding modes. These observations are comparable to those of IGHD3-9, which is

utilized by HA stem antibodies with various IGHV genes and can bind to HA stem in two

different reading frames[14]. Similarly, recent studies have identified IGHD3-22 as an IGHV-

independent recurring sequence feature of antibodies that target a conserved site on SARS-

CoV-2 spike[40,41]. Although antibody sequence analysis typically focuses on IGHV genes, the

contribution of IGHD genes to antibody responses should not be overlooked since emerging

evidence suggests that it might be more important than previously thought.

Although this study focused on influenza HA stem as a proof-of-concept, oPool[+] display can

be generalized to any antigens of interest as long as they can be recombinantly purified.

Importantly, oPool[+] display can be leveraged for epitope mapping, given that it enables

competition screening. Such application will be particularly valuable for antigens that have

largely unknown antigenicity but have several antibodies with known epitopes, such as those

from emerging pathogens[42,43]. Furthermore, the capability of constructing custom-made

antibody libraries means that oPool[+] display has the potential to benefit the development of

machine learning models for antibody engineering, specificity prediction, and *de novo* design,

as a major throughput bottleneck still exists in experimental validation[16,44–46]. We envision

that prediction results from these models can be rapidly validated by oPool[+] display, which

will in turn facilitate iterative refinement of the models for more advanced applications.

We acknowledge that oPool[+] display has some limitations. First, oPool[+] display requires

antibodies to be presented as scFvs, which may lose functionality compared to its Fab

counterpart[47–49]. Second, antibodies with a fast off-rate may result in false negatives in

oPool[+] display, since it depends on monovalent binding. Inadequate wash during selection

could also partially explain the false positive hits in our results. Nonetheless, a few solutions

can be adopted in future studies. Performing multiple rounds of mRNA display selection, or

replacing it with other protein display technologies that support multivalent binding, such as

yeast display and phage display, can further reduce false negative rate[50,51]. In addition, a

more stringent wash protocol can potentially reduce false positive rate. As the length of oligo

pool synthesis continues to improve, the cost and complexity of oPool⁺ display will further

decrease. Overall, we believe that oPool⁺ display represents a starting point for the future

advancement of high-throughput approaches to characterize antibodies.

MATERIALS AND METHODS

Selection of HA antibodies for paired antibody library synthesis

Members of the natively paired antibody library were selected from a previously curated

dataset containing 5,561 human monoclonal antibodies to influenza HA from 60 research

publications and three patents[16]. Filters were applied to exclude antibodies that 1) had

incomplete sequence information, 2) utilized germline genes that were regarded as recurring

sequence features of HA stem antibodies, namely IGHV1-69, IGHV6-1, IGHV1-18 and

IGHD3-9[7,12–14], and 3) were members of known HA stem antibody clonotypes. This resulted

in 292 antibody sequences from 7 publications[7,17–19,23,52,53]. Three HA stem antibodies,

namely 31.a.55, AG11-2F01, and 042-100809-2F04, as well as 30 HA head antibodies were

randomly selected as positive and negative controls[6,7,15,17–25]. Of note, both AG11-2F01 and

042-100809-2F04 were not previously labeled as an HA stem antibody in the curated

dataset[16]. Through literature search, AG11-2F01 was found to compete with CR9114[10],

which is an HA stem antibody, for binding to H1[17], while 042-100809-2F04 was found to bind

to group 2 HA stem domain[54].

Computational design of the oligo pool sequences for assembly

A summary of the computational design pipeline is described below and summarized in

Figure S1.

Sequence preparation

Selected antibody sequences were first annotated using abYsis[55]. Any missing nucleotides

at the 5' and/or 3' ends were then filled in using the sequences from the IGHV and IGHJ

genes that had the highest identity with the given antibody.

Codon randomization and pool assignment of the antibodies

To decrease undesired assembly during antibody library synthesis, codon randomization of

each selected antibody sequence was first performed to reduce nucleotide sequence

similarity among different antibodies. For a given amino acid, codon usages <15% in

Escherichia coli were removed from consideration to prevent low translation efficiency during

RNA display. For 325 antibodies, total of 2 million randomized sequences were generated to

maximize downstream sequence differentiation. All antibody sequences were then split into

8 segments, followed by clustering using CD-HIT[56]. The clusters were generated using the

criterion of 70% sequence identity (at least 30% differences between each cluster). The

antibody sequences were then reconstructed by selecting necessary segments from

different clusters, followed by removing the used clusters. Such reconstruction was repeated

until a complete pool (total of 25 antibody sequences) had been reassembled. The deleted

clusters were then added back with the reassembled antibody sequences removed. The

process was then iterated to generate the remaining pools.

Selection of overlap regions and generation of the final oligo pools

Upon the pool assignment of antibodies, the ideal overlap regions were searched over CDR

L3, H1, and H3 of each antibody sequence. Six 30-nucleotide long sequences were

extracted from each region through frame shifting, then aligned to the complete antibody

sequences in the corresponding pool using BLAST+[57]. For each antibody, the overlap

sequences that are least similar to other antibodies in the pool were selected. The antibody

sequences were then split at the overlap region, followed by the addition of universal

adaptor regions at fragments encoding the N-terminal and C-terminal of the antibodies,

leading to the generation of the final oligo pools.

Overlap PCR assembly of the natively paired antibody library

A total of 13 oligo pools were synthesized (Integrated DNA Technologies). The lengths of oligos ranged from around 180 to 330 nucleotides. Each oligo pool contained 100 oligos resuspended in 200 µL water. An assembly PCR was set up for each oligo pool using 1,600 ng of oligos as input. The assembly was performed using KAPA HiFi HotStart ReadyMix (Roche) and a Mastercycler nexus GX2 (Eppendorf). PCR was set up in the absence of primers. From cycles 1-40, PCR was performed with minimal ramp rate (0.1°C/s) in between the denaturing (98°C, 20 s) and annealing steps (62°C, 15 s) to reduce erroneous annealing events. After cycle 40, a universal forward primer 5'-TTC <u>TAA TAC GAC TCA CTA TAG</u> GGA CAA TTA CTA AAG GAG TAT CC-3' and a universal reverse primer 5'-GGA GCC GCT ACC <u>CTT ATC GTC GTC ATC CTT GTA ATC</u> GGA TCC T-3' were added to the PCR. The underlined region in the forward primer sequence is the T7 promoter, whereas the underlined region in the reverse primer sequence encodes a FLAG tag. Subsequently, another 15 cycles of PCR were performed to amplify the assembled product. The final PCR product was purified using a Monarch Gel Extraction Kit (New England Biolabs). Two replicates of the assembly were performed.

Preparation of the biotinylated H1 stem and H3 stem constructs

The H1 stem (mini-HA #4900)[29], H3 stem (H3ssF)[30], as well as the seven HA ectodomain constructs were cloned into a customized baculovirus transfer vector. Both constructs contained a N-terminal gp67 signal peptide at the N-terminus as well as a BirA biotinylation site, a thrombin cleavage site, a trimerization domain and a 6×His-tag at the C-terminus. Recombinant bacmid DNA that carried the H1 stem construct or H3 stem construct was generated using the Bac-to-Bac system (Thermo Fisher Scientific) per manufacturer's instructions. Baculovirus was generated by transfecting the purified bacmid DNA into adherent Sf9 cells using Cellfectin reagent (Thermo Fisher Scientific) per manufacturer's

instructions. The baculovirus was further amplified by passaging in adherent Sf9 cells at a

multiplicity of infection (MOI) of 1.

Recombinant HA constructs were then expressed using 1L of suspension Sf9 cells at an

MOI of 1. At day 3 post-infection, Sf9 cells were pelleted by centrifugation at 4,000 $\times$g for 25

min. Soluble recombinant HA constructs were purified from the supernatant by affinity

chromatography using Ni Sepharose excel resin (Cytiva) and then size exclusion

chromatography using a HiLoad 16/100 Superdex 200 prep grade column (Cytiva) in 20 mM

Tris-HCl at pH 8.0, and 100 mM NaCl. The purified protein was concentrated by an Amicon

spin filter (Millipore Sigma) and filtered by a 0.22 mm centrifuge Tube Filter (Costar). The

purified HA constructs were then biotinylated using a Biotin-Protein Ligase-BIRA kit (Avidity)

according to the manufacturer's instructions. The biotinylated proteins were then purified

again through size exclusion chromatography as described above. The A280 absorbance

values were measured using a Nanodrop One (Thermo Fisher Scientific) to quantify the

protein concentration.

Antibody screening using mRNA display

The mRNA display was performed based on the protocols provided by previous studies[27,28,58]

with slight modifications.

Generation of the puromycin-conjugated mRNA templates

The DNA library was first transcribed by a MEGAscript T7 Transcription Kit (Thermo Fisher

Scientific) and purified by a MEGAclear Transcription Clean-Up Kit (Thermo Fisher Scientific)

according to manufacturer's instructions. Ligation was performed using 1 nmol of the mRNA

product, 1.1 nmol of the splint oligo (5'-TTT TTT TTT TTT GGA GCC GCT ACC-3'), and 1.2

nmol of the puromycin linker (5'-/5Phos/-d(A)21-(C$_9$)3-d(ACC)-puromycin-3') by the T4 DNA

ligase (New England Biolabs) in a 100 μL reaction for 1 hour at room temperature, followed

by Lambda exonuclease (New England Biolabs) digestion for 30 mins at 37°C. The

puromycin-conjugated mRNA product was purified using a Dynabeads mRNA DIRECT

Purification Kit (Thermo Fisher Scientific), aliquoted, and stored at -20°C until used.

Preparation of the mRNA-scFv fusion library

The puromycin-conjugated mRNA templates were translated using a PURExpress In Vitro

Protein Synthesis Kit (New England Biolabs) with the addition of PURExpress Disulfide

Bond Enhancer (New England Biolabs) for 1 hour at 37°C. The reaction was then incubated

with 500 mM KCl and 60 mM $MgCl_2$ for at least 30 mins at room temperature to promote

fusion between the translated scFv and puromycin. EDTA was then added to dissociate

ribosomes. The full-length mRNA-scFv product was then purified using Anti-FLAG M2

Magnetic Beads (Millipore Sigma) followed by elution using $3\times$ FLAG peptides (GlpBio).

Subsequently, the purified mRNA-scFv product was reverse transcribed using SuperScript

IV reverse transcriptase (Thermo Fisher Scientific). The cDNA/mRNA-scFv product was

referred as the "pre-selection library".

Preparation of the magnetic beads coated with biotinylated HAs

Biotinylated HA constructs were coated onto the Dynabeads M280-straptavidin (Thermo

Fisher Scientific) according to the manufacturer's instruction. Briefly, 150 pmol of biotinylated

proteins were incubated with 50 μL of the beads for 30 mins to 1 hour at room temperature

with gentle rotation. The beads were then washed with TBST (20 mM Tris-HCl at pH 7.5,

100mM NaCl, and 0.025% Tween-20) five times using the DynaMag-2 magnetic holder

(Thermo Fisher Scientific) and then resuspended to the original volume.

Antibody selection against HAs

Selection of antibodies against HA constructs were carried out in parallel. Briefly, the pre-

selection library was mixed with 25 μL of beads coated with each HAs and incubated for 1

hour at room temperature with gentle rotation. After incubation, the beads were washed

thrice with 400 µL TBST. The beads were then resuspended in water. These samples were

referred as the "post-selection libraries".

Antibody selection against HAs with CR9114 competition

The CR9114 competition screen was performed as describe above with the addition of a

CR9114 blocking step prior to the selection. In brief, 25 µL beads coated with HAs were

blocked with 2uM CR9114 IgG[10], followed by the addition of 7.5uL of input library and

incubation for 1 hour at room temperature with gentle rotation. After incubation, the beads

were washed thrice with 400 µL TBST. The beads were then resuspended in water. These

samples were referred as the "post-selection libraries".

Next-generation sequencing of the scFv library

The pre-selection libraries, post-selection libraries, and the small pool assemblies selected

for quality control were amplified using PrimeSTAR Max DNA Polymerase (Takara Bio) per

manufacturer's instruction with the following primers (5'-GTA AAA CGA CGG CCA GTT TCA

GGG GAC AAT TAC TAA AGG AGT ATC C-3' and 5'- CAG GAA ACA GCT ATG ACC CAC

TCG TCA TCC TTG TAA TCG GAT CCT CCG GA-3'. The PCR product was purified using a

Monarch Gel Extraction Kit (New England Biolabs). A second round of PCR was carried out

to add the adapter sequence and index to the amplicons (**Table S9**). The final PCR products

were sequenced on one SMRTcell 8M on a PacBio Revio system using the CCS sequencing

mode and a 30-hour movie time.

Analysis of next-generation sequencing data

Circular consensus sequences (CCSs) were generated from the raw subreads using

SMRTLink v13.0, setting the parameters to require 99.9% accuracy and a minimum of 3

passes. CSSs in FASTQ format were parsed using the SeqIO module in BioPython[59] and

filtered based on the base calling quality score, where any read with more than five

nucleotides of phred quality score <40 were removed. The adapter sequences were then

identified on each read and trimmed from the scFv sequences. Reads that did not have the

complete adapter sequences were also removed. The filtered reads were then aligned to the

reference scFv sequences and classified into three categories: 1) natively paired scFvs with

no mutation, 2) natively paired scFvs with mutation, 3) others (non-natively paired scFvs and

incomplete assemblies). Only the reads encoding natively paired scFvs with no mutation

were used for downstream analysis. Frequency (*F*) of a scFv *i* a given replicate *k* of a given

antigen *s* was computed for each replicate as follows:

516
$$F_{i,k,s} = \frac{readcount_{i,k,s}+1}{\sum_s (readcount_{i,k,s}+1)} \quad (1)$$

517 A pseudocount of 1 was added to each mutant to avoid division by zero in subsequent steps.

518 We then calculated the enrichment (*E*) of a scFv *i* of a given replicate *k* of a given antigen *s*

519 after the mRNA display selection as follows:

520
$$E_{i,k,s} = \frac{F_{post-selection,i,k,s}}{F_{pre-selection,i,k}} \quad (2)$$

521 We calculated the mean enrichment of a scFv *i* of a given antigen *s* over two replicates, then

522 inferred the binding score (*BS*) of a scFv *i* of a given antigen *s* using robust scaling:

523
$$BS_{i,s} = \frac{E_{i,s}-median(E)}{IQR(E)} \quad (3)$$

524 Where *median(E)* represents the median of a given dataset, *IQR(E)* representing the

525 interquartile range of a given dataset. Custom cutoffs were set for each screen to determine

526 hits (**Table S10**). For a given antigen *s*, the CR9114 competition index (*CI*) of a scFv *i* was

527 computed as below:

528
$$CI_{i,s} = \log_{10} \frac{E_{HA\,screen\,without\,CR\,9114,i,s}}{E_{HA\,screen\,with\,CR\,9114,i,s}} \quad (4)$$

Expression and purification of Fabs and IgGs

Heavy and light chains of the antibodies were cloned into a phCMV3 vector with a mouse

immunoglobulin kappa signal peptide in human IgG1 Fc or Fab format. Plasmids encoding

the heavy and light chains of antibodies were transfected into Expi293F cells using an

ExpiFectamine 293 transfection kit (Gibco) in a 2:1 mass ratio for IgG or a 1:1 mass ratio for

Fab following the manufacturer's protocol. Supernatant was harvested at 6 days post-

transfection and centrifuged at 4,000 ×g for 30 mins at 4°C to remove cells and debris. The

supernatant was subsequently clarified using a polyethersulfone membrane filter with a 0.22

mm pore size (Millipore). Antibodies were first purified by CaptureSelect CH1-XL beads

(Thermo Fisher Scientific). Then, the antibodies were further purified by size exclusion

chromatography using a HiLoad 16/100 Superdex 200 prep grade column (Cytiva) in 1×

PBS. The A280 were measured using the Nanodrop One (Thermo Fisher Scientific) to

calculate the sample concentration. Antibodies were stored at 4°C until used.

Expression and purification of FLAG-tagged CR9114 scFv

CR9114 scFv nucleotide sequence with a pelB secretion peptide at the N-terminal and a

FLAG-tag (DYKDDDK) followed by a stop codon at the C-terminal were synthesized

(Integrated DNA Technologies) and ligated into a pET-28a plasmid vector backbone using

NEBuilder HiFi DNA Assembly Master Mix (New England Biolabs). The ligated product was

then transformed into DH5α competent cells (Thermo Fisher Scientific), and the plasmids

were extracted using a QIAprep Spin Miniprep Kit (Qiagen). The plasmids were then

transformed into BL21(DE3) competent cells (Thermo Fisher Scientific), followed by

overnight growth at 37°C, 225 rpm shaking. 100 mL LB culture (Fisher Scientific) were

inoculated at 1:500 ratio using the overnight culture and shaken at 37°C, 225 rpm. Once the

OD_{600} reached approximately 0.6, IPTG (1 mM final concentration) was added to induce

protein expression for 16 hours at 30°C, 200 rpm.

The overnight culture was centrifuged at 4,500 ×g, 4°C for 1 hour to remove the supernatant.

The pellet was resuspended using 2 mL of ice-cold 1× TES buffer (200 mM Tris-HCl at pH

8.0, 0.65 mM EDTA, and 0.5 M sucrose). The resuspended mixture was incubated at 4°C for

2 hours with gentle shaking. 5 mL of ice-cold 0.25× TES buffer was then added, followed by

incubation at 4°C overnight. The mixture was centrifuged at 4,500 ×g, 4°C for 1 hour to

remove the pellet. The supernatant was subsequently clarified using a polyethersulfone

membrane filter with a 0.22 mm pore size (Millipore) and purified using ANTI-FLAG M2

Affinity Gel (Millipore-Sigma) per manufacturer's instructions. The A280 was measured using

the Nanodrop One (Thermo Fisher) to calculate the sample concentration.

Expression, purification, and quantitation of selected scFvs for validation

Nucleotide sequences of selected scFvs with a T7 promoter at the N-terminal and a FLAG-

tag (DYKDDDK) followed by a stop codon at the C-terminal were synthesized (Integrated

DNA Technologies) and amplified by PCR using Prime STAR Max DNA polymerase (Takara

Bio). The PCR product was purified using a PureLink PCR purification kit (Thermo Fisher

Scientific) and used as the template for *in vitro* translation using a PURExpress In Vitro

Protein Synthesis Kit (New England Biolabs) with the addition of PURExpress Disulfide

Bond Enhancer (New England Biolabs). The translated scFvs were then reverse purified

using Pierce High-Capacity Ni-IMAC magnetic beads (Thermo Fisher Scientific) per

manufacturer's instructions to remove all His-tagged translation kit components.

To measure the concentration of the purified scFv, quantitation assays were performed by

biolayer interferometry (BLI) using an Octet Red instrument (Sartorius). Briefly, rat anti-FLAG

tag monoclonal antibody (L5) (Thermo Fisher Scientific) at 5 µg/mL in 1× kinetics buffer (1×

PBS at pH 7.4, and 0.002% v/v Tween 20) were loaded onto ProG biosensors (Sartorius),

then incubated with the 40× diluted scFv sample (5 µL of sample added to 195 µL of 1×

kinetics buffer). The standard curve was generated via 2-fold serial dilutions using FLAG-

tagged CR9114 scFv. The assay consisted of five steps: (1) baseline: 60 s with 1× kinetics

buffer; (2) antibody capture: 180 s with rat anti-FLAG antibody; (3) baseline: 60 s with 1×

kinetics buffer; (4) binding rate measurement: 120 s with standard and scFv samples; and (5)

regeneration: 5s in regeneration buffer (0.1 M Glycine at pH 3.0) followed by 5 s in

neutralization buffer (1 M Tris-HCl at pH 7.5), repeated 3 times. The data were analyzed

using Octet analysis software 9.0, where the first 30 s of the binding rate measurement were

used for final quantitation.

Validation of oPool⁺ display via biolayer interferometry

The binding assay was performed by biolayer interferometry (BLI) using an Octet Red

instrument (Sartorius). 1× kinetics buffer (1× PBS at pH 7.4, and 0.002% v/v Tween 20)

were used for all experiments. Details of each experiment were described below:

Systematic binding validation

SA biosensors and Fab2G biosensors (Sartorius) were used for to validate binding of

selected antibodies against the nine HA constructs. HA or Fab constructs at 20 µg/mL in 1×

kinetics buffer were loaded onto the biosensors and incubated with 10 µg/mL Fabs/HAs.

Measurements with NA and each Fab were also taken to serve as the baseline. The assay

consisted of five steps: (1) baseline: 60 s with 1× kinetics buffer; (2) loading: 60 s with

biotinylated HA or Fab; (3) baseline: 60 s with 1× kinetics buffer; (4) association: 60 s with

Fab or HA samples; and (5) dissociation: 60 s with 1× kinetics buffer. The binding response

during the association step were recorded.

Fab K_D measurement

Biotinylated H1 or H3 stem construct at 0.5 µM in 1× kinetics buffer was loaded onto SA

biosensors (Sartorius) and incubated with 33 nM, 100 nM, and 300 nM of purified Fabs. The

assay consisted of five steps: (1) baseline: 60 s with 1× kinetics buffer; (2) loading: 120 s

with biotinylated HA stem domains; (3) baseline: 60 s with 1× kinetics buffer; (4) association:

120 s with Fab samples; and (5) dissociation: 120 s with 1× kinetics buffer. For estimating

the exact K_D, a 1:1 binding model was used.

scFv K_D measurement

Biotinylated H1 or H3 stem construct at 0.5 µM in 1× kinetics buffer was loaded onto SA

biosensors (Sartorius) and incubated with 9× dilution (20 µL of sample added to 160uL of 1×

kinetics buffer) and 18× dilution (10 µL of sample added to 170 µL of 1× kinetics buffer) of

the purified scFv sample. The assay consisted of five steps: (1) baseline: 60 s with 1×

kinetics buffer; (2) loading: 180 s with biotinylated HA stem domains; (3) baseline: 60 s with

1× kinetics buffer; (4) association: 120 s with Fab samples; and (5) dissociation: 120 s with

1× kinetics buffer. For estimating the exact K_D, a 1:1 binding model was used.

CR9114 competition assay

SA biosensors and NTA biosensors (Sartorius) were used for to validate CR9114 competition

of selected antibodies. HA constructs at 20 µg/mL in 1× kinetics buffer were first loaded onto

the biosensors, then incubated with 20 µg/mL CR9114 Fab until saturation in binding,

immediately followed by incubation with the selected Fabs. A no-CR9114 control experiment

was performed concurrently for each Fab-antigen pair. The assay consisted of five steps: (1)

baseline: 60 s with 1× kinetics buffer; (2) loading: 480 s with HAs; (3) baseline: 60 s with 1×

kinetics buffer; (4) first association: 180 s with CR9114 Fab or 1× kinetics buffer; and (5)

second association: 120 s with 10 µg/mL selected Fabs. Of note, competition assays of SI06

with 009-10-1G06, 045-09-1G05, 009-10-2F01, and 051-10-2B05 were done in the reverse

order, where the first association consist of 900 s incubation with the selected Fabs, followed

by 120 s second association with 10 µg/mL CR9114 Fab. The binding response of the first

60 s in step (5) were recorded, and the CR9114 competition % of a given antibody *i* against

antigen *s* were calculated as below:

$$CR9114\ competition\ \%_{i,s} = (1 - \frac{Response_{w/CR9114\ Fab,i,s}}{Response_{w/oCR9114\ Fab,i,s}}) \times 100\% \quad (5)$$

Expression and purification of HA ectodomains

The HA ectodomains of H1N1 A/Puerto Rico/8/1934, H1N1 A/Beijing/262/1995, H1N1

A/Brisbane/02/2018 were cloned, expressed, and purified as mentioned above for the HA

constructs used for screening. The HA ectodomains of H1N1 A/California/04/2009 (NR-

15749), H5N1 A/bald eagle/Florida/W22-134-OP/2022 (NR-59476), H5N2 A/snow

goose/Missouri/CC15-84A/2015 (NR-50651), and H5N8 A/northern pintail/WA/40964/2014

(NR-50174) were obtained from BEI Resources (https://www.beiresources.org/). The HA

ectodomains of H1N1 A/USSR/90/1977 and H1N1 A/Taiwan/01/1986 were purchased from

SinoBiological.

Cryo-EM sample preparation, data collection, and data processing

AG11-2F01 Fab in complex with H1/SI06 HA

The AG11-2F01 Fab was incubated with H1/SI06 HA on ice overnight followed by size exclusion chromatography. The peak fraction of the Fab-HA complex was concentrated to around 1 mg/mL for cryo-EM sample preparation. Cryo-EM grids were prepared using a Vitrobot Mark IV (Thermo Fisher Scientific). 3.5 µL of the sample was applied to a 300-mesh Quantifoil R1.2/1.3 Cu grid pretreated with glow-discharge. Excess liquid was blotted away using filter paper with blotting force -5 and blotting time 3 s. The grid was then flash frozen in liquid ethane. Movies were then collected on a Titan Krios microscope equipped with Gatan BioQuantum K3 imaging filter and camera (Thermo Fisher Scientific). Images were recorded at 130,000× magnification, corresponding to a pixel size of 0.33 Å/pixel at super-resolution mode of the camera. A defocus range of -0.8 µm to -1.5 µm was set. A total dose of 50 $e^-/Å^2$ of each exposure was fractionated into 50 frames. Both untilted and 30-degree-tilted data were collected and combined to alleviate the preferred orientation problem of the sample.

CryoSPARC[60] was used to process the cryo-EM data. For model building, ABodyBuilder[61] was used to generate an initial model for AG11-2F01 Fab. This model, together with the model of H1/SI06 HA (PDB 6FYT)[62], was fitted into the cryo-EM density map using UCSF Chimera[63]. The model was manually adjusted in Coot[64] and refined with Phenix real-space refinement program[65]. This process was iterated for several cycles until no significant improvement of the model was observed.

16.ND.92 Fab in complex with H1/SI06 HA

The 16.ND.92 Fab was incubated with H1/SI06 HA and FISW84 Fab, a known HA anchor antibody[66], on ice overnight followed by size exclusion chromatography. The peak fraction of the Fab-HA complex was concentrated to around 3 mg/mL for cryo-EM sample preparation. 0.1% (w/v) of n-octyl-ß-D-glucoside was added to reduce orientation bias. Cryo-EM grids

were prepared using a Vitrobot Mark IV (Thermo Fisher Scientific). 3 μL of the sample was

applied to a 400-mesh Quantifoil R1.2/1.3 Cu grid pretreated with glow-discharge. Excess

liquid was blotted away using filter paper with blotting force 0 and blotting time 3 s. The grid

was then flash frozen in liquid ethane. Movies were then collected on a Titan Krios

microscope equipped with Gatan BioQuantum K3 imaging filter and camera (Thermo Fisher

Scientific). Images were recorded at 81,000× magnification, corresponding to a pixel size of

0.53 Å/pixel at super-resolution mode of the camera. A defocus range of -0.5 μm to -5 μm

was set. A total dose of 57.35 e⁻/Å² of each exposure was fractionated into 40 frames.

CryoSPARC[60] was used to process the cryo-EM data. DeepEMhancer[67] was used to

generate the sharpened density map for downstream model building. For model building,

IgFold[68] was used to generate an initial model for 16.ND.92 Fab. This model, together with

the model of H1/SI06 HA (PDB 6FYT)[62], was fitted into the cryo-EM density map using

Phenix DockinMap module[69]. The models were manually adjusted in Coot[64] and refined with

Phenix real-space refinement program[65]. This process was iterated for several cycles until

no significant improvement of the model was observed.

Structural analysis of HA-antibody complexes

Buried surface areas upon binding and paratope residues of AG11-2F01, 16.ND.92,

MEDI8852 (PDB 5JW4), 56.a.09 (PDB 5K9J), 54-1G05 (PDB 6WIZ), PN-SIA28 (PDB 8GV5),

39.29 (PDB 4KVN), and 429 B01 (PDB 6NZ7)[7,9,31–34] were analyzed using PDBePISA[70]. The

CDRH3 region and IGHD 3-3 usage of each antibody was annotated using IgBLAST[71]. The

molecular interactions of AG11-2F01 and 16.ND.92 in complex with H1/SI06 HA were

analyzed and visualized using PyMOL (Schrödinger).

Enzyme-linked immunosorbent assay (ELISA)

Nunc MaxiSorp ELISA plates (Thermo Fisher Scientific) were coated overnight at 4°C with

100 μL of recombinant proteins at 1 μg/mL in 1× PBS. The next day, plates were washed

thrice with 1× PBS containing 0.05% Tween 20 and blocked with 200 µl of 5% non-fat milk in

1× PBS for 2 hours at room temperature. For systematic validation of oPool⁺ display, 10

µg/mL of monoclonal antibodies were added to the plates, and incubated for 2 hours at 37°C;

for functional characterization of AG11-2F01 and 16.ND.92, monoclonal antibodies were

serially diluted 10-fold starting from 100 µg/mL, added to the plates, and incubated for 2

hours at 37°C. Plates were then washed thrice and incubated with horseradish peroxidase

(HRP)-conjugated goat anti-human IgG antibody (Thermo Fisher Scientific) at 1:5,000

dilution for 1 hour at 37°C. After six washes with 1× PBS containing 0.05% Tween 20, 100

µL of 1-Step TMB ELISA Substrate Solution (Thermo Fisher Scientific) was added to each

well. After incubation for 10 mins, the reaction was stopped with 50 µL of 2 M H_2SO_4 solution,

and absorbance values were measured at 450 nm (OD_{450}) using a BioTek Synergy HTX

Multimode Reader (Agilent).

Recombinant virus construction and purification

Recombinant viruses with HA and NA segments from the indicated H1N1 strains and six

internal segments from H1N1 A/Puerto Rico/8/1934 (PR8) were obtained from BEI

Resources (https://www.beiresources.org/). Recombinant viruses were rescued using the

eight-plasmid reverse genetics system[72]. Briefly, plasmids encoding the HA segments from

H1N1 A/California/07/2009 and H1N1 A/Michigan/45/2015 along with seven plasmids

encoding the other seven segments from PR8 were transfected into a co-culture of

HEK293T (human embryonic kidney) cells and MDCK-SIAT1 (Madin-Darby Canine Kidney)

cells at a 6:1 ratio. Supernatants were injected into 8-10 days old embryonated chicken eggs

and incubated at 37°C for 48 hours. Viruses in the allantoic fluid were plaque-purified on

MDCK-SIAT1 cells grown in Dulbecco's Modified Eagles Medium (Gibco) containing 10%

fetal bovine serum (Gibco) and a penicillin-streptomycin mix (100 U/mL penicillin and 100

µg/mL streptomycin, Gibco). The HA sequence of each virus was confirmed by Sanger

sequencing.

Microneutralization assay

For the microneutralization assay, MDCK-SIAT1 cells were seeded in 96-well plates. After

reaching 100% confluency, MDCK-SIAT1 cells were washed once with $1\times$ PBS. Minimal

essential media (Gibco) containing 25 mM HEPES (Gibco) was then added to the cells.

Monoclonal antibodies were serially diluted 10-fold starting from 100 µg/ml and mixed with

100 $TCID_{50}$ (median tissue culture infectious dose) of viruses at equal volume and incubated

at 37°C for 1 hour. Subsequently, the mixture was inoculated into cells and incubated at

37°C for another hour. Cell supernatants were discarded and replaced with minimal

essential media containing 25 mM HEPES, and 1 µg/mL TPCK-trypsin (Sigma). Plates were

incubated at 37°C for 72 hours, and virus presence was detected by hemagglutination assay

to determine the MN_{50} titers.

Mice

The animal experiments were performed in accordance with protocols approved by UIUC

Institutional Animal Care and Use Committee (IACUC). Six-week-old female BALB/c mice

(Jackson Laboratory) were used for all animal experiments.

Prophylactic and therapeutic protection experiments

Female BALB/c mice at 6 weeks old (n = 5 per group) were anesthetized with isoflurane and

intranasally infected with $5\times$ lethal dose (LD_{50}) of recombinant PR8 virus. Mice were given

the indicated antibody at a dose of 5 mg/kg intraperitoneally at 4 hours before infection

(prophylaxis) or 4 hours after infection (therapeutics). Weight loss was monitored daily for 14

days. The humane endpoint was defined as a weight loss of 25% from initial weight at day 0.

Of note, while our BALB/c mice were not modified to facilitate interaction with human IgG1,

human IgG1 could interact with mouse Fc gamma receptors[73–75].To determine the lung viral

titers at day 3 post-infection, lungs of infected mice were harvested and homogenized in 1

mL of minimal essential media with 10% bovine serum albumin using a gentleMACS C Tube

(Miltenyi Biotec). Subsequently, virus titers were measured by $TCID_{50}$ assay.

ACKNOWLEDGEMENTS

We thank Anders Olson, Chris Brooke, David Kranz, and Steve Sligar for helpful discussion

and the Roy J. Carver Biotechnology Center at the University of Illinois at Urbana-

Champaign for assistance with PacBio sequencing. We thank Kristen Flatt and the Materials

Research Laboratory Central Research Facilities at the University of Illinois at Urbana-

Champaign for access to cryo-EM instrumentation during the screening of the Fab-HA

complexes. We are grateful to the Cryo-EM Core and the Core Facility for Advanced

Research Computing at Case Western Reserve University for the access of cryo-EM

instrumentation and data processing. We also thank Frank Vago and the Cryo-EM Facility at

Purdue University for the access of cryo-EM instrumentation and data collection. This work

is supported by National Institutes of Health R01 AI167910 (N.C.W.), DP2 AT011966

(N.C.W.), the Searle Scholars Program (N.C.W.), Howard Hughes Medical Institute

Emerging Pathogens Initiative (N.C.W.), UIUC William T. and Lynn Jackson Graduate

Student Fellowship (W.O.O.), UIUC Gregorio Weber Graduate Student Fellowship (W.O.O.),

and Carl R. Woese Institute for Genomic Biology Postdoctoral Fellowship (H.L.).

AUTHOR CONTRIBUTIONS

W.O.O. and N.C.W. conceived and designed the study. W.O.O., H.L., W.L., Y.W., K.E.D. and

N.C.W. developed the methodology. W.O.O. and L.T. assembled the library and performed

mRNA display experiment. W.O.O., W.L. and N.C.W. analyzed the PacBio sequencing data.

W.O.O., H.L., R.L., M.T., A.B.G. and L.A.R. expressed and purified recombinant proteins.

W.O.O., Z.M., R.L., T.P., X.D., and N.C.W. performed structural analysis of the antibodies.

W.O.O., H.L., D.C., and M.R.A performed functional characterization of the antibodies. X.D.

and N.C.W. provided resources and support. W.O.O. H.L., W.L. and N.C.W. wrote the paper,

and all authors reviewed and edited the paper.

DECLARATION OF INTERESTS

N.C.W. consults for HeliXon. The authors declare no other competing interests.

DATA & CODE AVAILABILITY

Raw sequencing data have been submitted to the NIH Short Read Archive under accession number: BioProject PRJNA1150188. Cryo-EM density maps and coordinates have been deposited to EMDB and PDB with accession numbers: EMD-46727 and EMD-45930; PDB 9DBX and 9CU7. Custom scripts as well as raw data for experimental validations have been deposited to: https://github.com/nicwulab/oPool_display.

 MAIN FIGURES

Figure 1. Curation and synthesis of the natively paired HA antibody library. (A) The

overall breakdown of the HA antibody library. **(B)** Design of oligos for scFv assembly. Each

given scFv construct contains a T7 promoter and a start codon at the N-terminal as well as a

FLAG tag at the C-terminal. The scFv sequences were then split into 4 fragments at the

selected CDR regions, with overlap between adjacent fragments. Through an overlap PCR,

oligos of the same construct would preferably anneal to each other, ensuring the assembly

of natively paired scFvs. **(C)** Synthesis of the natively paired HA antibody library.

Synthesized oligo pools containing scFv fragments were assembled via a two-stage PCR

(**see Materials and Methods**). **(D)** The unassembled and assembled oligo pools were

compared by agarose gel electrophoresis. "U": unassembled oligo pool. "Rep1": replicate 1.

"Rep2": replicate 2. The red arrow indicates the target size (800-900 bp) for full length scFvs.

(E-F) The reproducibility **(E)** and coverage **(F)** of the scFv assembly using varying numbers

of scFv per PCR, ranging from 25 to 200. The Pearson correlation coefficient (*R*) of the

occurrence frequencies of individual scFvs between the two replicates were indicated.

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available via Bio Icons.

Figure 2. Rapid specificity characterization of the natively paired antibodies by mRNA display. The screening results of each scFv are shown as a heatmap. *X*-axis represents the scFv names. *Y*-axis represents each individual screens. Screens against CR9114 IgG pre-bound HAs are indicated by "+CR9114". Binding scores shown were adjusted with robust scaling. Individual cutoffs were set for each screen to determine positive hits (**Table S4, Materials and Methods**). Black circles at the top of the heatmap indicate head antibody controls, whereas empty circles indicate stem antibody controls.

Figure 3. Systematic validation of oPool+ display. (A-B) Binding activity of 25 antibodies against different HAs was measured by **(A)** biolayer interferometry (BLI) with antibodies in Fab format and **(B)** ELISA with antibodies in IgG format. **(A)** The response signals during the association phase and **(B)** the OD$_{450}$ values were shown as heatmaps. The dots represent the hits in oPool+ display. X-axis represents antibody names. Y-axis represents antigen names. **(C)** Binary confusion matrices based on BLI and ELISA validations are shown. **(D)**

831   Binding affinity of selected HA stem antibody candidates in both scFv and Fab format. Their

832   dissociation constants (K_D) against H1 stem and H3 stem are shown as heatmaps. Of note,

833   31.a.55 was a positive control for binding to both H1 stem and H3 stem[7], AG11-2F01 was a

834   positive control for binding to H1 stem[17], and 042-100809-2F04 was a positive control for

835   binding to H3 stem[54].

Figure 4. CR9114 competition profile of validated antibodies. (A) CR9114 competition indices of validated antibodies. The competition indices calculated from oPool⁺ display are shown. High positive values indicate CR9114 competition, low positive and high negative values indicate no CR9114 competition. **(B)** CR9114 competition of validated antibodies based on BLI results, shown as scatter plot against the competition indices. The response of each antibody binding to the antigen were measured during the association step with or without prior saturation binding of CR9114. The percentage of competition is shown with the range of 0% (no competition) to 100% (complete competition). Pearson correlation coefficient (R) between replicates is indicated. The linear fit lines are shown as red dash lines. Representative antibodies are labelled.

Figure 5. Structural analysis of AG11-2F01 and 16.ND.92. (A) Cryo-EM structures of

AG11-2F01 and 16.ND.92 in complex with H1/SI06 HA. HA1 is in light grey. HA2 is in dark

grey. Heavy chain variable domain (V_H) is in orange. Light chain variable domain (V_L) is in

pink. **(B)** Epitopes of AG11-2F01 and 16.ND.92. V_H contacts are in orange. V_L contacts are

in pink. Contacts shared by both V_H and V_L are in purple. **(C)** Interactions between light

chain and HA are shown. H-bonds are represented by black dashed lines. **(D)** Interactions

854   between CDR H3 and HA are shown. **(E)** Overlay of the CDR H3 loops from IGHD3-3 HA-

855   stem antibodies. HA is in surface representation. **(F)** Contributions of CDR H3 (orange), non-

856   CDR H3 V_H (yellow), and V_L (pink) to the paratope buried surface areas (BSA) of the

857   indicated antibodies. **(G)** Contributions of IGHD3-3-encoded residues to V_H paratope BSA of

858   the indicated antibodies.

Figure 6. *in vitro* and *in vivo* protection of AG11-2F01 and 16.ND.92. (A) The binding

activities of AG11-2F01 and 16.ND.92 against recombinant HA proteins from the indicated

H1 and H5 strains were measured by ELISA. The EC_{50} values are shown as a heatmap. **(B)**

The neutralization activity of AG11-2F01 and 16.ND.92 against different recombinant H1N1

viruses was measured by a microneutralization assay. The IC_{50} values are shown as a

heatmap. **(A-B)** Strain names are abbreviated as follows: H1N1 A/Puerto Rico/8/1934

(H1/PR8), H1N1 A/USSR/90/1977 (H1/USSR77), H1N1 A/Chile/1/1983 (H1/CH83), H1N1

A/Taiwan/01/1986 (H1/TW86), H1N1 A/Beijing/262/1995 (H1/BJ95), H1N1 A/Solomon

Island/3/2006 (H1/SI06), H1N1 A/Brisbane/59/2007 (H1/BR07), H1N1 A/California/04/2009

(H1/CA09), H1N1 A/Michigan/45/2015 (H1/MI15), H1N1 A/Brisbane/02/2018 (H1/BR18),

H5N8 A/northern pintail/WA/40964/2014 (H5/WA14), H5N2 A/snow goose/Missouri/CC15-

84A/2015 (H5/MO15), and H5N1 A/bald eagle/Florida/W22-134-OP/2022 (H5/FL22). H1

stem and H3 stem represents the HA stem constructs designed based on H1N1

A/Brisbane/59/2007 HA and H3N2 A/Finland/486/2004 HA, respectively[29,30]. **(C-H)** The *in*

vivo protection activity of AG11-2F01 and 16.ND.92 against lethal challenge of PR8 virus

was assessed by **(C-D)** weight loss profiles, **(E-F)** Kaplan-Meier survival curves, and **(G-H)**

lung viral titers at day 3 post-infection. *P* values were computed by two-tailed student's t-test.

***: $P < 0.001$; **: $P < 0.01$; n.s.: not significant.

Table S10. Custom cutoff for each screen.

REFERENCES

1. Pedrioli, A., and Oxenius, A. (2021). Single B cell technologies for monoclonal antibody
discovery. Trends Immunol. *42*, 1143–1158. https://doi.org/10.1016/j.it.2021.10.008.

2. Valldorf, B., Hinz, S.C., Russo, G., Pekar, L., Mohr, L., Klemm, J., Doerner, A., Krah, S.,
Hust, M., and Zielonka, S. (2022). Antibody display technologies: selecting the cream of
the crop. Biol. Chem. *403*, 455–477. https://doi.org/10.1515/hsz-2020-0377.

3. Persson, M.A., Caothien, R.H., and Burton, D.R. (1991). Generation of diverse high-
affinity human monoclonal antibodies by repertoire cloning. Proc. Natl. Acad. Sci. U. S. A.
88, 2432–2436. https://doi.org/10.1073/pnas.88.6.2432.

4. Sheets, M.D., Amersdorfer, P., Finnern, R., Sargent, P., Lindquist, E., Schier, R.,
Hemingsen, G., Wong, C., Gerhart, J.C., and Marks, J.D. (1998). Efficient construction
of a large nonimmune phage antibody library: the production of high-affinity human
single-chain antibodies to protein antigens. Proc. Natl. Acad. Sci. U. S. A. *95*, 6157–6162.
https://doi.org/10.1073/pnas.95.11.6157.

5. Kirkpatrick, E., Qiu, X., Wilson, P.C., Bahl, J., and Krammer, F. (2018). The influenza
virus hemagglutinin head evolves faster than the stalk domain. Sci. Rep. *8*, 10432.
https://doi.org/10.1038/s41598-018-28706-1.

6. Zost, S.J., Wu, N.C., Hensley, S.E., and Wilson, I.A. (2019). Immunodominance and
antigenic variation of Influenza virus hemagglutinin: implications for design of universal
vaccine immunogens. J. Infect. Dis. *219*, S38–S45. https://doi.org/10.1093/infdis/jiy696.

7. Joyce, M.G., Wheatley, A.K., Thomas, P.V., Chuang, G.-Y., Soto, C., Bailer, R.T., Druz, A.,
Georgiev, I.S., Gillespie, R.A., Kanekiyo, M., et al. (2016). Vaccine-induced antibodies
that neutralize group 1 and group 2 influenza A viruses. Cell *166*, 609–623.
https://doi.org/10.1016/j.cell.2016.06.043.

8. Corti, D., Voss, J., Gamblin, S.J., Codoni, G., Macagno, A., Jarrossay, D., Vachieri, S.G.,
Pinna, D., Minola, A., Vanzetta, F., et al. (2011). A neutralizing antibody selected from
plasma cells that binds to group 1 and group 2 influenza A hemagglutinins. Science *333*,
850–856. https://doi.org/10.1126/science.1205669.

936 9. Kallewaard, N.L., Corti, D., Collins, P.J., Neu, U., McAuliffe, J.M., Benjamin, E., Wachter-
937   Rosati, L., Palmer-Hill, F.J., Yuan, A.Q., Walker, P.A., et al. (2016). Structure and function
938   analysis of an antibody aecognizing all influenza A subtypes. Cell *166*, 596–608.
939   https://doi.org/10.1016/j.cell.2016.05.073.

940 10. Dreyfus, C., Laursen, N.S., Kwaks, T., Zuijdgeest, D., Khayat, R., Ekiert, D.C., Lee, J.H.,
941   Metlagel, Z., Bujny, M.V., Jongeneelen, M., et al. (2012). Highly conserved protective
942   epitopes on influenza B viruses. Science *337*, 1343–1348.
943   https://doi.org/10.1126/science.1222908.

944 11. Wu, N.C., and Wilson, I.A. (2020). Influenza hemagglutinin structures and antibody
945   recognition. Cold Spring Harb. Perspect. Med. *10*, a038778.
946   https://doi.org/10.1101/cshperspect.a038778.

947 12. Andrews, S.F., Graham, B.S., Mascola, J.R., and McDermott, A.B. (2018). Is it possible
948   to develop a "universal" influenza virus vaccine? Immunogenetic considerations
949   underlying B-cell biology in the development of a pan-subtype influenza A vaccine
950   targeting the hemagglutinin stem. Cold Spring Harb. Perspect. Biol. *10*, a029413.
951   https://doi.org/10.1101/cshperspect.a029413.

952 13. Pappas, L., Foglierini, M., Piccoli, L., Kallewaard, N.L., Turrini, F., Silacci, C., Fernandez-
953   Rodriguez, B., Agatic, G., Giacchetto-Sasselli, I., Pellicciotta, G., et al. (2014). Rapid
954   development of broadly influenza neutralizing antibodies through redundant mutations.
955   Nature *516*, 418–422. https://doi.org/10.1038/nature13764.

956 14. Wu, N.C., Yamayoshi, S., Ito, M., Uraki, R., Kawaoka, Y., and Wilson, I.A. (2018).
957   Recurring and adaptable binding motifs in broadly neutralizing antibodies to influenza
958   virus are encoded on the D3-9 segment of the Ig gene. Cell Host Microbe *24*, 569-
959   578.e4. https://doi.org/10.1016/j.chom.2018.09.010.

960 15. Cheung, C.S.-F., Fruehwirth, A., Paparoditis, P.C.G., Shen, C.-H., Foglierini, M., Joyce,
961   M.G., Leung, K., Piccoli, L., Rawi, R., Silacci-Fregni, C., et al. (2020). Identification and
962   structure of a multidonor class of head-directed influenza-neutralizing antibodies reveal
963   the mechanism for its recurrent elicitation. Cell Rep. *32*, 108088.
964   https://doi.org/10.1016/j.celrep.2020.108088.

16. Wang, Y., Lv, H., Teo, Q.W., Lei, R., Gopal, A.B., Ouyang, W.O., Yeung, Y.-H., Tan, T.J.C.,
Choi, D., Shen, I.R., et al. (2024). An explainable language model for antibody specificity
prediction using curated influenza hemagglutinin antibodies. Immunity.
https://doi.org/10.1016/j.immuni.2024.07.022.

17. Henry, C., Zheng, N.-Y., Huang, M., Cabanov, A., Rojas, K.T., Kaur, K., Andrews, S.F.,
Palm, A.-K.E., Chen, Y.-Q., Li, Y., et al. (2019). Influenza virus vaccination elicits poorly
adapted B cell responses in elderly individuals. Cell Host Microbe *25*, 357-366.e6.
https://doi.org/10.1016/j.chom.2019.01.002.

18. Andrews, S.F., Huang, Y., Kaur, K., Popova, L.I., Ho, I.Y., Pauli, N.T., Henry Dunand, C.J.,
Taylor, W.M., Lim, S., Huang, M., et al. (2015). Immune history profoundly affects
broadly protective B cell responses to influenza. Sci. Transl. Med. *7*, 316ra192.
https://doi.org/10.1126/scitranslmed.aad0522.

19. Dugan, H.L., Guthmiller, J.J., Arevalo, P., Huang, M., Chen, Y.-Q., Neu, K.E., Henry, C.,
Zheng, N.-Y., Lan, L.Y.-L., Tepora, M.E., et al. (2020). Preexisting immunity shapes
distinct antibody landscapes after influenza virus infection and vaccination in humans.
Sci. Transl. Med. *12*, eabd3601. https://doi.org/10.1126/scitranslmed.abd3601.

20. Ekiert, D.C., Kashyap, A.K., Steel, J., Rubrum, A., Bhabha, G., Khayat, R., Lee, J.H.,
Dillon, M.A., O'Neil, R.E., Faynboym, A.M., et al. (2012). Cross-neutralization of
influenza A viruses mediated by a single antibody loop. Nature *489*, 526–532.
https://doi.org/10.1038/nature11414.

21. Henry, C., Palm, A.-K.E., Utset, H.A., Huang, M., Ho, I.Y., Zheng, N.-Y., Fitzgerald, T.,
Neu, K.E., Chen, Y.-Q., Krammer, F., et al. (2019). Monoclonal antibody responses after
recombinant hemagglutinin vaccine versus subunit inactivated influenza virus vaccine: a
comparative study. J. Virol. *93*, e01150-19. https://doi.org/10.1128/JVI.01150-19.

22. Hu, H., Voss, J., Zhang, G., Buchy, P., Zuo, T., Wang, L., Wang, F., Zhou, F., Wang, G.,
Tsai, C., et al. (2012). A human antibody recognizing a conserved epitope of H5
hemagglutinin broadly neutralizes highly pathogenic avian influenza H5N1 viruses. J.
Virol. *86*, 2978–2989. https://doi.org/10.1128/JVI.06665-11.

23. Liu, Y., Tan, H.-X., Koutsakos, M., Jegaskanda, S., Esterbauer, R., Tilmanis, D., Aban, M.,

Kedzierska, K., Hurt, A.C., Kent, S.J., et al. (2019). Cross-lineage protection by human
antibodies binding the influenza B hemagglutinin. Nat. Commun. *10*, 324.
https://doi.org/10.1038/s41467-018-08165-y.

24. Watanabe, A., McCarthy, K.R., Kuraoka, M., Schmidt, A.G., Adachi, Y., Onodera, T.,
Tonouchi, K., Caradonna, T.M., Bajic, G., Song, S., et al. (2019). Antibodies to a
conserved Influenza head interface epitope protect by an IgG subtype-dependent
mechanism. Cell *177*, 1124-1135.e16. https://doi.org/10.1016/j.cell.2019.03.048.

25. Lee, J., Boutz, D.R., Chromikova, V., Joyce, M.G., Vollmers, C., Leung, K., Horton, A.P.,
DeKosky, B.J., Lee, C.-H., Lavinder, J.J., et al. (2016). Molecular-level analysis of the
serum antibody repertoire in young adults before and after seasonal influenza
vaccination. Nat. Med. *22*, 1456–1464. https://doi.org/10.1038/nm.4224.

26. Roberts, R.W., and Szostak, J.W. (1997). RNA-peptide fusions for the in vitro selection
of peptides and proteins. Proc. Natl. Acad. Sci. U. S. A. *94*, 12297–12302.
https://doi.org/10.1073/pnas.94.23.12297.

27. Wu, N.C., Dai, L., Olson, C.A., Lloyd-Smith, J.O., and Sun, R. (2016). Adaptation in
protein fitness landscapes is facilitated by indirect paths. eLife *5*, e16965.
https://doi.org/10.7554/eLife.16965.

28. Tanaka, S., Olson, C.A., Barnes, C.O., Higashide, W., Gonzalez, M., Taft, J., Richardson,
A., Martin-Fernandez, M., Bogunovic, D., Gnanapragasam, P.N.P., et al. (2022). Rapid
identification of neutralizing antibodies against SARS-CoV-2 variants by mRNA display.
Cell Rep. *38*, 110348. https://doi.org/10.1016/j.celrep.2022.110348.

29. Impagliazzo, A., Milder, F., Kuipers, H., Wagner, M.V., Zhu, X., Hoffman, R.M.B., van
Meersbergen, R., Huizingh, J., Wanningen, P., Verspuij, J., et al. (2015). A stable trimeric
influenza hemagglutinin stem as a broadly protective immunogen. Science *349*, 1301–
1306. https://doi.org/10.1126/science.aac7263.

30. Corbett, K.S., Moin, S.M., Yassine, H.M., Cagigi, A., Kanekiyo, M., Boyoglu-Barnum, S.,
Myers, S.I., Tsybovsky, Y., Wheatley, A.K., Schramm, C.A., et al. (2019). Design of
nanoparticulate group 2 influenza virus hemagglutinin stem antigens that activate
unmutated ancestor B cell receptors of broadly neutralizing antibody lineages. mBio *10*,

e02810-18. https://doi.org/10.1128/mBio.02810-18.

31. Wu, N.C., Andrews, S.F., Raab, J.E., O'Connell, S., Schramm, C.A., Ding, X., Chambers,
M.J., Leung, K., Wang, L., Zhang, Y., et al. (2020). Convergent evolution in breadth of
two VH6-1-encoded Influenza antibody clonotypes from a single donor. Cell Host
Microbe *28*, 434-444.e4. https://doi.org/10.1016/j.chom.2020.06.003.

32. Matsuda, K., Huang, J., Zhou, T., Sheng, Z., Kang, B.H., Ishida, E., Griesman, T.,
Stuccio, S., Bolkhovitinov, L., Wohlbold, T.J., et al. (2019). Prolonged evolution of the
memory B cell response induced by a replicating adenovirus-influenza H5 vaccine. Sci.
Immunol. *4*, eaau2710. https://doi.org/10.1126/sciimmunol.aau2710.

33. Chen, Y., Wang, F., Yin, L., Jiang, H., Lu, X., Bi, Y., Zhang, W., Shi, Y., Burioni, R., Tong,
Z., et al. (2022). Structural basis for a human broadly neutralizing influenza A
hemagglutinin stem-specific antibody including H17/18 subtypes. Nat. Commun. *13*,
7603. https://doi.org/10.1038/s41467-022-35236-y.

34. Nakamura, G., Chai, N., Park, S., Chiang, N., Lin, Z., Chiu, H., Fong, R., Yan, D., Kim, J.,
Zhang, J., et al. (2013). An in vivo human-plasmablast enrichment technique allows
rapid identification of therapeutic influenza A antibodies. Cell Host Microbe *14*, 93–103.
https://doi.org/10.1016/j.chom.2013.06.004.

35. Lanzavecchia, A., Frühwirth, A., Perez, L., and Corti, D. (2016). Antibody-guided vaccine
design: identification of protective epitopes. Curr. Opin. Immunol. *41*, 62–67.
https://doi.org/10.1016/j.coi.2016.06.001.

36. Haynes, B.F., Wiehe, K., Borrow, P., Saunders, K.O., Korber, B., Wagh, K., McMichael,
A.J., Kelsoe, G., Hahn, B.H., Alt, F., et al. (2023). Strategies for HIV-1 vaccines that
induce broadly neutralizing antibodies. Nat. Rev. Immunol. *23*, 142–158.
https://doi.org/10.1038/s41577-022-00753-w.

37. Toussi, S.S., Hammond, J.L., Gerstenberger, B.S., and Anderson, A.S. (2023).
Therapeutics for COVID-19. Nat. Microbiol. *8*, 771–786. https://doi.org/10.1038/s41564-
023-01356-4.

38. Schoeder, C.T., Gilchuk, P., Sangha, A.K., Ledwitch, K.V., Malherbe, D.C., Zhang, X.,

Binshtein, E., Williamson, L.E., Martina, C.E., Dong, J., et al. (2022). Epitope-focused immunogen design based on the ebolavirus glycoprotein HR2-MPER region. PLOS Pathog. *18*, e1010518. https://doi.org/10.1371/journal.ppat.1010518.

39. Hunt, A.C., Vögeli, B., Hassan, A.O., Guerrero, L., Kightlinger, W., Yoesep, D.J., Krüger, A., DeWinter, M., Diamond, M.S., Karim, A.S., et al. (2023). A rapid cell-free expression and screening platform for antibody discovery. Nat. Commun. *14*, 3897. https://doi.org/10.1038/s41467-023-38965-w.

40. Liu, L., Iketani, S., Guo, Y., Reddem, E.R., Casner, R.G., Nair, M.S., Yu, J., Chan, J.F.-W., Wang, M., Cerutti, G., et al. (2022). An antibody class with a common CDRH3 motif broadly neutralizes sarbecoviruses. Sci. Transl. Med. *14*, eabn6859. https://doi.org/10.1126/scitranslmed.abn6859.

41. Liu, H., Kaku, C.I., Song, G., Yuan, M., Andrabi, R., Burton, D.R., Walker, L.M., and Wilson, I.A. (2022). Human antibodies to SARS-CoV-2 with a recurring YYDRxG motif retain binding and neutralization to variants of concern including Omicron. Commun. Biol. *5*, 766. https://doi.org/10.1038/s42003-022-03700-6.

42. Robinson, J.E., Hastie, K.M., Cross, R.W., Yenni, R.E., Elliott, D.H., Rouelle, J.A., Kannadka, C.B., Smira, A.A., Garry, C.E., Bradley, B.T., et al. (2016). Most neutralizing human monoclonal antibodies target novel epitopes requiring both Lassa virus glycoprotein subunits. Nat. Commun. *7*, 11544. https://doi.org/10.1038/ncomms11544.

43. Chen, L., Sun, M., Zhang, H., Zhang, X., Yao, Y., Li, M., Li, K., Fan, P., Zhang, H., Qin, Y., et al. (2024). Potent human neutralizing antibodies against Nipah virus derived from two ancestral antibody heavy chains. Nat. Commun. *15*, 2987. https://doi.org/10.1038/s41467-024-47213-8.

44. Joubbi, S., Micheli, A., Milazzo, P., Maccari, G., Ciano, G., Cardamone, D., and Medini, D. (2024). Antibody design using deep learning: from sequence and structure design to affinity maturation. Brief. Bioinform. *25*, bbae307. https://doi.org/10.1093/bib/bbae307.

45. Bennett, N.R., Watson, J.L., Ragotte, R.J., Borst, A.J., See, D.L., Weidle, C., Biswas, R., Shrock, E.L., Leung, P.J.Y., Huang, B., et al. (2024). Atomically accurate de novo design of single-domain antibodies. BioRxiv Prepr. Serv. Biol., 2024.03.14.585103.

https://doi.org/10.1101/2024.03.14.585103.

46. Frey, N.C., Hotzel, I., Stanton, S.D., Kelly, R.L., Alberstein, R.G., Makowski, E.K.,
Martinkus, K., Berenberg, D., Bevers, J., Bryson, T., et al. (2025). Lab-in-the-loop
therapeutic antibody design with deep learning. Preprint at bioRxiv,
https://doi.org/10.1101/2025.02.19.639050 https://doi.org/10.1101/2025.02.19.639050.

47. Wu, N.C., Grande, G., Turner, H.L., Ward, A.B., Xie, J., Lerner, R.A., and Wilson, I.A.
(2017). In vitro evolution of an influenza broadly neutralizing antibody is modulated by
hemagglutinin receptor specificity. Nat. Commun. *8*, 15371.
https://doi.org/10.1038/ncomms15371.

48. Quintero-Hernández, V., Juárez-González, V.R., Ortíz-León, M., Sánchez, R., Possani,
L.D., and Becerril, B. (2007). The change of the scFv into the Fab format improves the
stability and in vivo toxin neutralization capacity of recombinant antibodies. Mol. Immunol.
44, 1307–1315. https://doi.org/10.1016/j.molimm.2006.05.009.

49. Kang, T.H., and Seong, B.L. (2020). Solubility, stability, and avidity of recombinant
antibody fragments expressed in microorganisms. Front. Microbiol. *11*.
https://doi.org/10.3389/fmicb.2020.01927.

50. Rondot, S., Koch, J., Breitling, F., and Dübel, S. (2001). A helper phage to improve
single-chain antibody presentation in phage display. Nat. Biotechnol. *19*, 75–78.
https://doi.org/10.1038/83567.

51. Chao, G., Lau, W.L., Hackel, B.J., Sazinsky, S.L., Lippow, S.M., and Wittrup, K.D. (2006).
Isolating and engineering human antibodies using yeast surface display. Nat. Protoc. *1*,
755–768. https://doi.org/10.1038/nprot.2006.94.

52. Huang, K.-Y.A., Rijal, P., Schimanski, L., Powell, T.J., Lin, T.-Y., McCauley, J.W., Daniels,
R.S., and Townsend, A.R. (2015). Focused antibody response to influenza linked to
antigenic drift. J. Clin. Invest. *125*, 2631–2645. https://doi.org/10.1172/JCI81104.

53. Li, G.-M., Chiu, C., Wrammert, J., McCausland, M., Andrews, S.F., Zheng, N.-Y., Lee, J.-
H., Huang, M., Qu, X., Edupuganti, S., et al. (2012). Pandemic H1N1 influenza vaccine
induces a recall response in humans that favors broadly cross-reactive memory B cells.

Proc. Natl. Acad. Sci. U. S. A. *109*, 9047–9052. https://doi.org/10.1073/pnas.1118979109.

54. Henry Dunand, C.J., Leon, P.E., Kaur, K., Tan, G.S., Zheng, N.-Y., Andrews, S., Huang,
M., Qu, X., Huang, Y., Salgado-Ferrer, M., et al. (2015). Preexisting human antibodies
neutralize recently emerged H7N9 influenza strains. J. Clin. Invest. *125*, 1255–1268.
https://doi.org/10.1172/JCI74374.

55. Swindells, M.B., Porter, C.T., Couch, M., Hurst, J., Abhinandan, K.R., Nielsen, J.H.,
Macindoe, G., Hetherington, J., and Martin, A.C.R. (2017). abYsis: Integrated antibody
sequence and structure-management, analysis, and prediction. J. Mol. Biol. *429*, 356–
364. https://doi.org/10.1016/j.jmb.2016.08.019.

56. Fu, L., Niu, B., Zhu, Z., Wu, S., and Li, W. (2012). CD-HIT: accelerated for clustering the
next-generation   sequencing   data.   Bioinformatics   *28*,   3150–3152.
https://doi.org/10.1093/bioinformatics/bts565.

57. Camacho, C., Coulouris, G., Avagyan, V., Ma, N., Papadopoulos, J., Bealer, K., and
Madden, T.L. (2009). BLAST+: architecture and applications. BMC Bioinformatics *10*,
421. https://doi.org/10.1186/1471-2105-10-421.

58. Olson, C.A., Wu, N.C., and Sun, R. (2014). A comprehensive biophysical description of
pairwise epistasis throughout an entire protein domain. Curr. Biol. *24*, 2643–2651.
https://doi.org/10.1016/j.cub.2014.09.072.

59. Cock, P.J.A., Antao, T., Chang, J.T., Chapman, B.A., Cox, C.J., Dalke, A., Friedberg, I.,
Hamelryck, T., Kauff, F., Wilczynski, B., et al. (2009). Biopython: freely available Python
tools for computational molecular biology and bioinformatics. Bioinformatics *25*, 1422–
1423. https://doi.org/10.1093/bioinformatics/btp163.

60. Punjani, A., Rubinstein, J.L., Fleet, D.J., and Brubaker, M.A. (2017). cryoSPARC:
algorithms for rapid unsupervised cryo-EM structure determination. Nat. Methods *14*,
290–296. https://doi.org/10.1038/nmeth.4169.

61. Leem, J., Dunbar, J., Georges, G., Shi, J., and Deane, C.M. (2016). ABodyBuilder:
automated antibody structure prediction with data–driven accuracy estimation. mAbs *8*,
1259–1268. https://doi.org/10.1080/19420862.2016.1205773.

62. Laursen, N.S., Friesen, R.H.E., Zhu, X., Jongeneelen, M., Blokland, S., Vermond, J., van
Eijgen, A., Tang, C., van Diepen, H., Obmolova, G., et al. (2018). Universal protection
against influenza infection by a multidomain antibody to influenza hemagglutinin.
Science *362*, 598–602. https://doi.org/10.1126/science.aaq0620.

63. Pettersen, E.F., Goddard, T.D., Huang, C.C., Couch, G.S., Greenblatt, D.M., Meng, E.C.,
and Ferrin, T.E. (2004). UCSF Chimera--a visualization system for exploratory research
and analysis. J. Comput. Chem. *25*, 1605–1612. https://doi.org/10.1002/jcc.20084.

64. Emsley, P., and Cowtan, K. (2004). Coot: model-building tools for molecular graphics.
Acta Crystallogr. D Biol. Crystallogr. *60*, 2126–2132.
https://doi.org/10.1107/S0907444904019158.

65. Afonine, P.V., Poon, B.K., Read, R.J., Sobolev, O.V., Terwilliger, T.C., Urzhumtsev, A.,
and Adams, P.D. (2018). Real-space refinement in PHENIX for cryo-EM and
crystallography. Acta Crystallogr. Sect. Struct. Biol. *74*, 531–544.
https://doi.org/10.1107/S2059798318006551.

66. Benton, D.J., Nans, A., Calder, L.J., Turner, J., Neu, U., Lin, Y.P., Ketelaars, E.,
Kallewaard, N.L., Corti, D., Lanzavecchia, A., et al. (2018). Influenza hemagglutinin
membrane anchor. Proc. Natl. Acad. Sci. U. S. A. *115*, 10112–10117.
https://doi.org/10.1073/pnas.1810927115.

67. Sanchez-Garcia, R., Gomez-Blanco, J., Cuervo, A., Carazo, J.M., Sorzano, C.O.S., and
Vargas, J. (2021). DeepEMhancer: a deep learning solution for cryo-EM volume post-
processing. Commun. Biol. *4*, 874. https://doi.org/10.1038/s42003-021-02399-1.

68. Ruffolo, J.A., Chu, L.-S., Mahajan, S.P., and Gray, J.J. (2023). Fast, accurate antibody
structure prediction from deep learning on massive set of natural antibodies. Nat.
Commun. *14*, 2389. https://doi.org/10.1038/s41467-023-38063-x.

69. Millán, C., McCoy, A.J., Terwilliger, T.C., and Read, R.J. (2023). Likelihood-based
docking of models into cryo-EM maps. Acta Crystallogr. Sect. Struct. Biol. *79*, 281–289.
https://doi.org/10.1107/S2059798323001602.

70. Krissinel, E., and Henrick, K. (2007). Inference of macromolecular assemblies from

crystalline state. J. Mol. Biol. *372*, 774–797. https://doi.org/10.1016/j.jmb.2007.05.022.

71. Ye, J., Ma, N., Madden, T.L., and Ostell, J.M. (2013). IgBLAST: an immunoglobulin variable domain sequence analysis tool. Nucleic Acids Res. *41*, W34-40. https://doi.org/10.1093/nar/gkt382.

72. Neumann, G., Fujii, K., Kino, Y., and Kawaoka, Y. (2005). An improved reverse genetics system for influenza A virus generation and its implications for vaccine production. Proc. Natl. Acad. Sci. U. S. A. *102*, 16825–16829. https://doi.org/10.1073/pnas.0505587102.

73. Lei, R., Kim, W., Lv, H., Mou, Z., Scherm, M.J., Schmitz, A.J., Turner, J.S., Tan, T.J.C., Wang, Y., Ouyang, W.O., et al. (2023). Leveraging vaccination-induced protective antibodies to define conserved epitopes on influenza N2 neuraminidase. Immunity *56*, 2621-2634.e6. https://doi.org/10.1016/j.immuni.2023.10.005.

74. Overdijk, M.B., Verploegen, S., Ortiz Buijsse, A., Vink, T., Leusen, J.H.W., Bleeker, W.K., and Parren, P.W.H.I. (2012). Crosstalk between human IgG isotypes and murine effector cells. J. Immunol. Baltim. Md 1950 *189*, 3430–3438. https://doi.org/10.4049/jimmunol.1200356.

75. Dekkers, G., Bentlage, A.E.H., Stegmann, T.C., Howie, H.L., Lissenberg-Thunnissen, S., Zimring, J., Rispens, T., and Vidarsson, G. (2017). Affinity of human IgG subclasses to mouse Fc gamma receptors. mAbs *9*, 767–773. https://doi.org/10.1080/19420862.2017.1323159.

A Library breakdown

Stem: 3
Head: 30
325 total HA abs
Unknown: 292

B scFv construct design

Start codon | CDR L1 | CDR L2 | CDR L3 | Gly-Ser linker | CDR H1 | CDR H2 | CDR H3 | FLAG tag

T7   Variable light chain (V_L)   Variable heavy chain (V_H)

Split to 4 ssDNA fragments

Overlap PCR assembly

scFv with intended V_H-V_L pairing

D Assembled product

Ladder U Rep 1 Rep 2

1000 bp
500 bp
300 bp
100 bp

E One-pot PCR reproducibility

25 scFv $R = 0.98$
75 scFv $R = 0.75$
100 scFv $R = 0.93$
125 scFv $R = 0.97$
150 scFv $R = 0.95$
200 scFv $R = 0.95$

$\log_{10}$ scFv frequency (Rep 2)
$\log_{10}$ scFv frequency (Rep 1)

C Parallel assembly of natively paired scFvs

ssDNA (oligo) pool

Low ramp rate (0.1°C/s) annealing

Without primers

PCR Extension

PacBio sequencing

Add universal primers to amplify

F One-pot PCR coverage

PCR size	Coverage
25 scFv	25/25 (100%)
75 scFv	73/75 (97.3%)
100 scFv	93/100 (93%)
125 scFv	115/125 (92%)
150 scFv	138/150 (92%)
200 scFv	180/200 (90%)

A oPool⁺ display validation via Bio-layer Interferometry (BLI)

B oPool⁺ display validation via ELISA

C oPool⁺ display performance

Ab format: Fab	Pos. by screen	Neg. by screen
Pos. by BLI	41 (80.4%)	10 (19.6%)
Neg. by BLI	8 (4.6%)	166 (95.4%)

Ab format: IgG	Pos. by screen	Neg. by screen
Pos. by ELISA	43 (71.7%)	17 (28.3%)
Neg. by ELISA	6 (3.6%)	159 (96.4%)

D Binding affinity of selected stem antibodies

A CR9114 competition indices of validated antibodies

B CR9114 competition validation

A Structure overview

AG11-2F01
IGHD3-3 + IGKV1-5

16.ND.92
IGHD3-3 + IGKV1-5

HA1　HA2　V_H　V_L

B Epitope

AG11-2F01 epitope

16.ND.92 epitope

V_H contacts　V_L contacts　Shared contacts

C Light chain interactions

AG11-2F01

16.ND.92

Q42_{HA2}
Q38_{HA2}
D19_{HA2}
V_L W32
V_L S30
V_L Y94

K32_{HA1}
N46_{HA2}
Q42_{HA2}
Q38_{HA2}
D19_{HA2}
V_L S30
V_L W32
V_L N92
V_L Y94

D CDR H3 interactions

AG11-2F01

V40_{HA1}
T318_{HA1}
W21_{HA2}
V_H L100b
V_H F100
V52_{HA2}
T49_{HA2}
I48_{HA2}
I45_{HA2}
T41_{HA2}

16.ND.92

L292_{HA1}
L42_{HA1}
V40_{HA1}
V52_{HA2}
T318_{HA1}
I48_{HA2}
W21_{HA2}
V_H F100a
I56_{HA2}
V_H I100f
V_H I100e
V_H V100
I45_{HA2}
T41_{HA2}

E Comparison of CDR H3 conformations

AG11-2F01
16.ND.92
MEDI8852
56.a.09
54-1G05
PN-SIA28
39.29
429 B01

F Paratope buried surface area

CDRH3　Non-CDRH3 V_H　V_L

Paratope BSA

AG11-2F01, 16.ND.92, MEDI-8852, 56.a.09, 54-1G05, PN-SIA28, 39.29, 429 B01

G Contribution of IGHD3-3 to V_H paratope

V_H BSA

AG11-2F01, 16.ND.92, MEDI-8852, 56.a.09, 54-1G05, PN-SIA28, 39.29, 429 B01

AG11-2F01 & 16.ND.92 *in vitro* activity

A ELISA — EC$_{50}$ (µg/mL)

AG11-2F01, 16.ND.92

H1/USSR77, H1/TW86, H1/BJ95, H1/SI06, H1/CA09, H1/MI15, H1/BR18, H5/WA14, H5/MO15, H5/FL22, H1 stem, H3 stem

B Neutralization — IC$_{50}$ (µg/mL)

AG11-2F01, 16.ND.92

H1/PR8, H1/CH83, H1/BJ95, H1/BR07, H1/CA09, H1/MI15

AG11-2F01 *in vivo* protection

C Weight loss — % of initial weight vs dpi — Protection, Treatment, Control

E Survival — survival (%) vs dpi — Protection, Treatment, Control

G Day 3 lung titer — log$_{10}$ TCID$_{50}$/mL — Protection, Treatment, Control — *** *** n.s.

16.ND.92 *in vivo* protection

D Weight loss — % of initial weight vs dpi — Protection, Treatment, Control

F Survival — survival (%) vs dpi — Protection, Treatment, Control

H Day 3 lung titer — log$_{10}$ TCID$_{50}$/mL — Protection, Treatment, Control — *** *** **