

# Large-Scale Analysis of B-Cell Epitopes on Influenza Virus Hemagglutinin – Implications for Cross-Reactivity of Neutralizing Antibodies

The Harvard community has made this article openly available. Please share how this access benefits you. Your story matters.

Citation	Sun, Jing, Ulrich J. Kudahl, Christian Simon, Zhiwei Cao, Ellis L. Reinherz, and Vladimir Brusic. 2014. "Large-Scale Analysis of B-Cell Epitopes on Influenza Virus Hemagglutinin – Implications for Cross-Reactivity of Neutralizing Antibodies." Frontiers in Immunology 5 (1): 38. doi:10.3389/fimmu.2014.00038. http://dx.doi.org/10.3389/fimmu.2014.00038.
Published Version	doi:10.3389/fimmu.2014.00038
Accessed	April 17, 2018 4:46:23 PM EDT
Citable Link	http://nrs.harvard.edu/urn-3:HUL.InstRepos:11879832
Terms of Use	This article was downloaded from Harvard University's DASH repository, and is made available under the terms and conditions applicable to Other Posted Material, as set forth at http://nrs.harvard.edu/urn-3:HUL.InstRepos:dash.current.terms-of-use#LAA

(Article begins on next page)



# Large-scale analysis of B-cell epitopes on influenza virus hemagglutinin – implications for cross-reactivity of neutralizing antibodies

## Jing Sun<sup>1,2</sup>, Ulrich J. Kudahl<sup>1,3</sup>, Christian Simon<sup>1,3</sup>, Zhiwei Cao<sup>4</sup>, Ellis L. Reinherz<sup>1,2,5</sup> and Vladimir Brusic<sup>1,2</sup>\*

- <sup>1</sup> Cancer Vaccine Center, Dana-Farber Cancer Institute, Harvard Medical School, Boston, MA, USA
- <sup>2</sup> Department of Medicine, Harvard Medical School, Boston, MA, USA
- <sup>3</sup> Center for Biological Sequence Analysis, Technical University of Denmark, Lyngby, Denmark
- <sup>4</sup> School of Life Sciences and Technology, Tongji University, Shanghai, China
- <sup>5</sup> Laboratory of Immunobiology, Department of Medical Oncology, Dana-Farber Cancer Institute, Harvard Medical School, Boston, MA, USA

#### Edited by:

Ramit Mehr, Bar-Ilan University, Israel

#### Reviewed by:

Juan C. Almagro, Pfizer, Inc., USA Yanay Ofran, Bar-Ilan University, Israel

#### \*Correspondence:

Vladimir Brusic, Cancer Vaccine Center, Dana-Farber Cancer Institute, Harvard Medical School, 77 Avenue Louis Pasteur, HIM 401, Boston, MA 02115, USA e-mail: vladimir\_brusic@ dfci.harvard.edu

Influenza viruses continue to cause substantial morbidity and mortality worldwide. Fast gene mutation on surface proteins of influenza virus result in increasing resistance to current vaccines and available antiviral drugs. Broadly neutralizing antibodies (bnAbs) represent targets for prophylactic and therapeutic treatments of influenza. We performed a systematic bioinformatics study of cross-reactivity of neutralizing antibodies (nAbs) against influenza virus surface glycoprotein hemagglutinin (HA). This study utilized the available crystal structures of HA complexed with the antibodies for the analysis of tens of thousands of HA sequences. The detailed description of B-cell epitopes, measurement of epitope area similarity among different strains, and estimation of antibody neutralizing coverage provide insights into cross-reactivity status of existing nAbs against influenza virus. We have developed a method to assess the likely cross-reactivity potential of bnAbs for influenza strains, either newly emerged or existing. Our method catalogs influenza strains by a new concept named discontinuous peptide, and then provide assessment of cross-reactivity. Potentially cross-reactive strains are those that share 100% identity with experimentally verified neutralized strains. By cataloging influenza strains and their B-cell epitopes for known bnAbs, our method provides guidance for selection of representative strains for further experimental design. The knowledge of sequences, their B-cell epitopes, and differences between historical influenza strains, we enhance our preparedness and the ability to respond to the emerging pandemic threats.

Keywords: influenza virus, neutralizing antibodies, B-cell epitope, cross-reactivity, discontinuous peptide

#### **INTRODUCTION**

Influenza epidemics result in substantial morbidity and mortality (1). The World Health Organization (WHO) Global Influenza Network provides annual recommendations on antigenic variants to be included in the influenza vaccine formulations. Influenza virus has low-fidelity polymerases that result in high mutation rates (2). As a consequence, seasonal influenza viruses efficiently escape from acquired immunity in the human population through antigenic drift increasing the impact of seasonal influenza. The antigenic shift in influenza A viruses – the reassortment of multiple viral genomes resulting in new strains with recombined antigens leads to occasional worldwide pandemics that result in significant morbidity and, usually, high mortality. High transmissibility of influenza combined with rapid mutation rates makes the discovery of novel influenza therapeutics an imperative (3). The main challenge in developing antibody-based prophylactics and therapeutic vaccine against influenza is to understand the variation generated by the virus and developing means to elicit broadly neutralizing antibody responses.

The majority of neutralizing antibodies (nAbs) generated during a normal immune response target hemagglutinin (HA) and block viral entry into host cells (4). However, significant sequence diversity among HA genes limits the protective breadth of these nAbs (5). This sequence diversity of influenza A virus is high there are 17 HA serotypes that belong into two major groups called group 1 (Grp1: H1, H2, H5, H6, H8, H9, H11, H12, H13, H16, and H17), and group 2 (Grp2: H3, H4, H7, H10, H14, and H15) (6). C179, the first neutralizing antibody reported to neutralize strains from H1 and H2 of influenza A virus, was isolated from mice immunized with the A/Okuda/57 (H2N2) strain (7). Later it was found that C179 was able to cross-neutralize H1, H2, H5, H6, and H9 subtypes (8–11). The next major advance in the field came about 15 years later (12), a novel class of human antibodies encoded by the V<sub>H</sub>1-69 gene were discovered. Among these antibodies, a series of broadly neutralizing antibodies (bnAbs) have been described, such as CR6261 and F10 (13). Most bnAbs that neutralize influenza A virus have been reported to neutralize strains from either exclusively Grp1 or Grp2. FI6v3 (14) and 39.29 (5) are the only antibodies reported to neutralize human influenza isolates from both Grp1 and Grp2. Influenza B viruses are classified within a single influenza type, with two antigenically and genetically distinct lineages that co-circulate (15), represented by the prototype viruses B/Victoria/2/1987 (Victoria lineage) and B/Yamagata/16/1988 (Yamagata lineage) (16). Antibody CR8071 (17) is a bnAb against influenza B viruses, with neutralizing ability for both Victoria and Yamagata lineages. bnAb CR9114 (17) binds a conserved epitope on the HA stem and was shown to neutralize all tested influenza A viruses. However, it did not show *in vitro* neutralizing activity against influenza B viruses at the tested concentrations (17).

Generally, the neutralizing effectiveness of these bnAbs was evaluated using representative strains from the subtypes of influenza A virus or lineages of influenza B virus. Because of the high variability of HA genes, such evaluation might result in a conclusion that is limited to the tested viral variants. To determine the landscape of nAbs and better understand their cross-reactivity properties, we performed a systematic study of B-cell epitopes of a selection of nAbs against influenza virus. Antibodies recognize discrete sites on the surface of macromolecule called B-cell epitopes (antigenic determinants). Some 10% of B-cell epitopes are linear peptides while 90% are formed from discontinuous amino acids that create surface patches through the three dimensional (3D) conformation of proteins (18). We defined a novel way of describing discontinuous motifs, using virtual peptides, to represent B-cell epitopes and further used this representation to estimate potential cross-reactivity and neutralizing coverage of these nAbs.

Functional characterization of the increasing number of nAbs and known crystal structures of these nAbs complexed with HA proteins enables us to precisely define their B-cell epitopes. A large number of sequences of influenza variants are available in public databases (19) enabling systematic bioinformatics analysis of cross-reactivity of nAbs against influenza virus. Such systematic analysis improves our understanding of antibody/antigen interactions, facilitates mapping of the known universe of target antigens, and allows the prediction of cross-reactivity. These methods and tools are useful for the design of broadly protective vaccines against emerging pathogens. This article describes a study of influenza HA cross-reactivity, but the method is applicable to any viral pathogen where information about nAbs and a collection of variant sequences of the target antigen are available.

## **MATERIALS AND METHODS**

## **NEUTRALIZING ANTIBODIES AGAINST HEMAGGLUTININ**

The names and specificities of nAb against influenza virus HA were collected from published papers. Twenty-two nAbs against influenza virus with crystal structures available in PDB were collected from published articles (**Table 1**). Fifteen of these nAbs target at the globular head of HA, and for the other seven, the binding sites are located on HA stem region.

Location	Neutralizing antibodies	PDB ID	Neutralizing breadth	Reference
Head	1F1	4GXU	H1	(20)
	2D1	3LZF	H1	(21)
	2G1	4HG4	H2	(17)
	8F8	4HF5	H2	(17)
	8M2	4HFU	H2	(17)
	BH151	1EO8	A/X-31 (H3N2)	(22)
	C05	4FQR	H1, H2, H3, H9	(23)
	CH65	3SM5	H1	(24)
	CH67	4HKX	H1	(25)
	CR8059	4FQK	Influenza B virus	(17)
	CR8071	4FQJ	Influenza B virus: Yamagata and Victoria	(17)
	HC19	2VIR	A/X-31 (H3N2)	(26)
	HC45	1QFU	A/X-31 (H3N2)	(27)
	HC63	1KEN	A/X-31 (H3N2)	(28)
	S139/1	4GMS	H1, H2, H3, H13, H16	(8, 29)
Stem	39.29	4KVN	H1, H2, H3	(5)
	C179	4HLZ	Grp1: H1, H2, H5, H6, H9	(30)
	CR6261	3GBN/3GBM	Grp1: H1, H2, H5, H9	(31, 32)
	CR8020	3SDY	Grp2: H3, H7, H10	(33)
	CR9114	4FQI/4FQV/4FQY	Grp1: H1, H2, H5, H6, H8, H9, H12	(17)
			Grp2: H3, H4, H7, H10	
	F10	3FKU	Grp1: H1, H2, H5, H6, H8, H9, H11	(13)
	FI6v3	3ZTJ/3ZTN	H1, H3, H5, H7	(14)

Table 1 | Summary of well-characterized neutralizing antibodies against influenza virus.

The nAbs in underlined italics are nAbs specific for strain A/X-31 (H3N2). The designation of two groups (Grp1 and Grp2) of influenza A virus subtypes are shown in **Figure 1**.





The majority of these nAbs were observed to bind or neutralize influenza A virus isolated either from Grp1 or Grp2. Antibodies Fl6v3, CR9114, and 39.29 were shown to neutralize influenza strains within both Grp1 and Grp2 (5, 14, 27). Antibodies CR8059 and CR8071 (17) were the only two nAbs for influenza B virus. CR8059 is a light chain D95aN variant of CR8071. Since the mutation on CR8059 is not present at the binding interface and does not affect the binding, only CR8071 was used in the following study (17). The majority of these nAbs were shown to neutralize more than one strain, some of them are broadly neutralizing across subtypes of influenza A virus or lineages of influenza B virus. The Abs BH151, HC19, HC45, and HC63 were shown to specifically neutralize HA from the A/X-31(H3N2) strain. The available structures of nAb/HA complexes were downloaded from PDB (37).

#### VALIDATED INFLUENZA STRAINS BY NEUTRALIZING ANTIBODIES

Binding and neutralization assays were collected from published materials. Binding and non-binding strains were classified according to their affinity measurements. The thresholds used to discriminate binding and non-binding strains were inconsistent in different studies: the lowest affinity detectable values were set as  $10^{-4}$  M (17),  $10^{-5}$  M (33), and  $\sim 10^{-6}$  M (20). In some reports, nAbs showed positive binding results but did not display neutralization ability to the same strains [e.g., nAb CR9114 against strain B/Florida/4/2006 (Yamagata) (17)]. Because of the lack of standardized thresholds and ambiguous definition of binding, only



(highlighted as pink surface).

Binding site		Influenza A virus							
	Sa site	Near RBS	F subdomain	Stem base	Head base				
CROSS-F	REACTIVE	NEUTRAL	IZING ANTIBODIE	S					
nAbs	2D1	C05	CR6261	CR8020	CR8071				
		1F1	39.29		CR8059				
		2G1	C179						
		8F8	CR9114						
		8M2	F10						
		CH65	FI6v3						
		CH67							
		S139/1							
Binding	Head	RBS	Near RBS						
site	base								
X-31-SPE	CIFIC NEU	JTRALIZIN	G ANTIBODIES						
nAbs	BH151 HC45	HC19	HC63						

Table 2 | B-cell epitope regions of the 22 neutralizing antibodies.

The nAbs are classified as cross-reactive or X-31-specific. For each binding region, a representative nAb was selected (shown in bold) and its B-cell epitope was mapped on the structures shown in **Figure 3**.

results that indicate non-binding of antibodies were considered as useful information and were retained for the subsequent analysis as negatives.



The neutralized and the escape strains were detected using the microneutralization assay (38) or HA inhibition assay (39). Several measurements were suggested in these studies:

- 1. The lowest concentration of nAb that displayed inhibition of hemagglutination or microneutralizing activity were set as either  $2.5 \,\mu$ g/mL (40) or  $5 \,\mu$ g/mL (41).
- 2. The 50% inhibitory concentration was set to  $IC_{50} = 50 \,\mu g/mL (17)$ .
- 3. The effective concentration of antibody needed to inhibit at least 99% of viral infectivity was set as  $EC_{99} = 100 \,\mu\text{g/mL}$  (24, 25).

The HA sequences of strains that were experimentally validated for neutralization by studied antibodies ("validated strains") were retrieved from the literature. The influenza strains HA sequences were collected from the literature or, if absent, from the Influenza Knowledge Base (FLUKB)<sup>1</sup>. All experimentally validated strains were grouped into either neutralized strains or escape strains. The neutralized strains were selected based on reported experimental evidence. The escape strains included true escape strains as well as strains that were reported not to bind nAbs. We did not find any discrepancies in reported neutralizing properties across different studies used to collect functional data.

## **HEMAGGLUTININ SEQUENCES**

All HA sequences were downloaded from the Influenza Knowledge Base (FLUKB<sup>1</sup>, dated August 26th, 2013). After removing the incomplete sequences (fragments), 45,812 full-length HA sequences were left in the data set (HA sequence dataset) for further analysis.

# GENERATION OF MULTIPLE SEQUENCE ALIGNMENT OF HEMAGGLUTININ SEQUENCES

The HA sequences of influenza strains from FLUKB were aligned using the MAFFT tool (42). The resulting multiple sequence alignment (MSA) results provided a consistent numbering scheme for all the further analyses. MSA were generated for both experimentally validated strains of HA and for all entries from FLUKB. For each nAb, every HA sequence from the crystal structure and from the experimentally validated strains were searched individually within the FLUKB database to find a strain with highest similarity using BLAST (43). This procedure was done to ensure that residue position mapping in following steps is consistent with the numbering scheme.

## **IDENTIFICATION OF B-CELL EPITOPES**

B-cell epitope were identified from antigen–antibody structure, using a formula with the combination of the measurements of accessible surface area (ASA) and atom distance. For each residue from HA antigen, the ASA value was calculated using Naccess software (44) for both free HA and for HA coupled with an antibody. Residues  $r_i$  with ASA loss more than 20% were selected as epitope residues,

$$r_i \in \{\text{epitope residues}\} \text{ if } \frac{\text{ASA}_{\text{free}} - \text{ASA}_{\text{coupled}}}{\text{ASA}_{\text{free}}} > 0.2$$

<sup>&</sup>lt;sup>1</sup>http://research4.dfci.harvard.edu/cvc/flukb

Near RBS

	Sa				Ν	ear RB	S				Sa		
	2D1	1F1	2G1	8F8	8M2	C05	CH65	CH67	S139/1		2D1	1F1	2 <b>G</b> 1
A98	_	+	_	+	+	+	+	+	+	A163	+	_	_

Table 3	B-cell epi	itope overla	p for nAbs	targeting	HA hea	d region
Table 5	D-cen ep	nope ovena		largeting	IIA IICC	iu region

	2D1	1F1	2G1	8F8	8M2	C05	CH65	CH67	S139/1		2D1	1F1	2G1	8F8	8M2	C05	CH65	CH67	S139/1
A98	_	+	_	+	+	+	+	+	+	A163	+	_	_	_	_	_	_	_	_
A125	+	-	-	_	-	-	_	_	_	A165	+	_	-	_	-	_	_	_	-
A126	+	_	_	_	_	_	_	_	_	A166	+	_	_	_	_	_	_	_	-
A128	+	_	+	_	_	_	_	_	_	A167	+	_	_	_	_	_	_	_	-
A130	+	-	+	+	+	-	_	+	_	A169	+	_	-	_	-	_	_	_	-
A131	_	_	_	_	_	+	_	_	+	A183	_	+	_	_	_	+	+	_	+
A132	_	-	+	+	+	-	_	_	_	A185	-	+	-	_	-	_	_	_	-
A133	_	+	+	+	+	+	_	_	_	A186	_	+	_	_	+	+	_	_	+
A134	_	-	+	+	+	+	+	+	+	A187	-	+	-	+	+	+	+	+	-
A135	_	+	_	_	_	+	+	+	+	A188	_	_	_	_	+	_	_	_	-
A136	-	-	+	+	+	+	+	+	+	A189	-	+	-	+	+	+	+	+	+
A137	_	-	+	+	+	+	+	+	+	A190	-	+	+	+	+	+	+	+	+
A140	_	_	_	+	_	_	_	_	_	A192	_	+	_	_	+	+	+	+	+
A143	_	-	-	+	-	-	_	_	_	A193	-	+	+	+	+	+	+	+	+
A144	_	_	_	+	_	_	_	_	_	A194	_	+	+	+	+	+	+	+	+
A145	-		+	+	+	+	_	_	+	A196	-	+	-	_	-	-	+	+	+
A153	_	+	+	+	+	+	+	+	+	A197	+	_	-	_	-	_	_	_	_
A155	-	+	+	+	+	+	+	+	+	A219	-	+	-	_	-	-	_	+	-
A156	_	+	+	+	+	+	+	+	+	A222	-	+	-	_	+	_	+	_	-
A157	+	-	+	-	-	-	_	_	+	A225	-	+	-	_	+	+	+	+	+
A158	+	_	+	+	+	+	+	+	+	A226	_	+	_	+	+	+	+	+	+
A159	+	+	+	+	+	+	+	+	+	A227	_	+	_	_	+	+	+	_	-
A160	+	-	-	_	-	-	+	+	+	A228	-	+	-	_	+	+	_	_	+
A161	+	_	_	_	_	_	_	_	-	A246	+	_	_	_	_	_	_	_	_
A162	+	-	_	_	_	-	-	-	_	A248	+	-	-	-	-	-	_	-	_

The epitope residue positions of nine nAbs were mapped to the 1EO8 structure chain A. The symbol "+" indicates a contact epitope residue by corresponding nAb, and the symbol "-" means it is not a epitope position. 2D1, with a different epitope area to other eight nAbs, is labeled in red.

The majority of contacts between two contacting atoms occur at distance smaller than 5 Å separation (45). Euclidean distance was calculated between atoms  $a_i$  and  $a_j$  using their coordinates  $a_i(x_i, y_i, z_i)$  and  $a_i(x_i, y_i, z_i)$  in PDB structure data,

$$d_{ij} = \sqrt{(x_i - x_j)^2 + (y_i - y_j)^2 + (z_i - z_j)^2}.$$

Hemagglutinin residues  $r_i$  whose minimum atom distance to the closest nAb atom was within 4 Å were also incorporated in the epitope. The minimal atom distance was defined as:

 $d_{\min} = \min \{ d_{ij} \}, a_i \in \text{antigen residue } r_i, a_j \in \text{antibody residue } r_j,$  $r_i \in \{\text{epitope residue}\}$  if  $d_{\min} < 4\text{\AA}$ .

The residues that satisfy either of these two conditions (ASA loss or minimum distance) are considered to constitute a B-cell epitope.

The specific residues on HA that form hydrogen bonds, salt bridges, disulfide bonds, and covalent bonds between the HA and nAb were considered to define a B-cell epitope. The antigen/antibody interaction was further analyzed using PISA tool (46). The analysis of HA structures showed that all the hydrogen

bonds, salt bridges, disulfide bonds, and covalent bonds between HA and nAb in each studied structure were incorporated in B-cell epitopes defined in the previous step.

## EXTRACTION OF DISCONTINUOUS MOTIFS FROM VALIDATED STRAINS

For each nAb, using the MSA result and the standardized numbering, the residue positions of B-cell epitope identified from the HA/antibody crystal structure were mapped onto all HA sequence of validated strains. Then discontinuous motifs composed of mapped residues were extracted from these sequences. These discontinuous motifs were classified as either "neutralized" or "escape" motifs according to the experimental validation status of the corresponding strain.

#### MAPPING OF DISCONTINUOUS MOTIFS TO HA SEQUENCE DATASET

For each nAb, based on the MSA result, the residue positions of Bcell epitope identified from the HA/antibody crystal structure were mapped onto the HA sequence dataset. A "discontinuous peptide" composed of amino acids that form B-cell epitope, in order that they appear in the sequence, was extracted from each HA sequence. By comparing the discontinuous peptides to all validated neutralized and escape motifs from experimentally validated strains, each discontinuous peptide was classified as neutralized (if 100%



matching a neutralized epitope motif), escape (if 100% matching an escape epitope motif), or non-validated (if 100% matching validation data are missing). The term "discontinuous motif" indicates positions that define each B-cell epitope extracted from experimentally validated strains collected from publications, while term "discontinuous peptide" represents specific B-cell epitopes extracted from the HA sequence dataset.

#### **RESULTS**

#### **B-CELL EPITOPE REGIONS**

For each nAb, the B-cell epitope was identified from the crystal structure as described in Section "Materials and Methods." The structure of nAb F10-H5 (13) and identified epitope are illustrated in **Figure 2**. After B-cell epitopes of all studied nAbs were mapped to the same template structure, the overlapping of binding sites were found among different nAbs, particularly at the receptorbinding site (RBS), which is the necessary structure for binding to the sialic acid receptors during virus infection.

For cross-reactive nAbs against influenza A virus, four major binding locations on HA structure are apparent: two of them reside on the globular head of HA and the other two target the stem region of HA (**Table 2; Figure 3**). The RBS is a heavily targeted area, with overlapping epitopes defined by eight nAbs. The only nAb that binds HA head but not the RBS is 2D1 (21). The 2D1

recognizes the Sa site of A/South Carolina/1/1918(H1N1). Sa site is one of the earliest known antigenic sites (47), which is proximal to the receptor-binding pocket. The detailed comparison of epitope residue positions between 2D1 and the other HA headtargeted nAbs are listed in Table 3. In contrast to the Abs that interact with the HA head, a series of nAbs recognize another highly conserved helical region in the membrane-proximal HA stem. The epitopes on F subdomain (CR6261, 39.29, etc.) and stem base (CR8020) are adjacent to each other, with a small number of shared residues. The only broadly nAb neutralizing influenza B virus, CR8071 binds to the lower region of the globular head of HA – the "head base" (Figure 3C). All the remaining antibodies analyzed in our study bind specifically the HA on A/X-31(H3N2) strain. All X-31 specific nAbs complex with the membrane-distal domain of HA. NAbs BH151 and HC45 (22) recognize a single epitope located at the base of the eight-stranded antiparallel  $\beta$ sheet structure. The HC19 binding site is adjacent to the RBS. The HC63 epitope shares several residues with HC19, thereby the antibody binding site overlaps the membrane-distal domains of two HA monomers.

## EXPERIMENTALLY VALIDATED DISCONTINUOUS MOTIFS

Discontinuous motifs were extracted from the validated sequences as described in Section "Materials and Methods," and presented by WebLogo (48) and BlockLogo<sup>2</sup> [Ref. (49)]. WebLogo figures consist of stacks of amino acids, while the overall height of the stack indicates the sequence conservation at that position, and the height of symbols within the stack indicates the relative frequency of each amino or nucleic acid at that position. While BlockLogo is a web-based application for visualization of protein and nucleotide fragments, continuous protein sequence motifs, and discontinuous sequence motifs using calculation of block entropy from MSAs. The BlockLogo figures present the actual combinations of amino acids, and the height of each combination represents its relative frequency. In the nAb F10 as an example, the neutralized and escape discontinuous motifs are shown in Figures 4A,C (WebLogo figures), and Figures 4B,D (BlockLogo figures). WebLogos show a clear overall description of each residue conservation difference between individual neutralized and escape motifs. For example, 44N, 48T, 304R/D, 380L/Y, 391N, 394E/A/L on F10 epitope region are likely to contribute to the escape strains. In the BlockLogo figures, specific neutralized and escape B-cell epitopes of F10 were listed with their frequencies, which can be used for their direct comparison.

## ANALYSIS OF VARIATION OF DISCONTINUOUS PEPTIDES IN HA SEQUENCES DATASET

For each nAb, the residue positions of their B-cell epitopes were mapped on the complete HA sequences dataset collected from the FLUKB. Amino acid strings representing discontinuous peptides were extracted from the HA sequence of each strain. The variability of discontinuous peptides and validated discontinuous motif coverage were analyzed for each nAb.

For example, for the nAb F10, 589 different patterns of discontinuous peptides were generated among all 45,812 sequences in HA sequence dataset, using the F10 B-cell epitope identified from the crystal structure. In the next step, the discontinuous peptides were sorted according to their frequencies. The second most frequent peptide in FLUKB is identical an escape motif, while the 6th, 8th, and 19th are each identical to one of the neutralized motifs. However, the most frequent F10 discontinuous peptide in FLUKB (see text footnote 1) has not been experimentally tested (Figure 5), along with other 14 discontinuous peptides. The analysis of differences between the most frequent discontinuous peptide and neutralized or escape motifs was inconclusive. Therefore future experimental studies should include a representative sequence containing the discontinuous peptide HHVLSLPTVDGWLTQITVNI that is present in more than 10,000 entries in the FLUKB. We also recommend that motifs 1, 4, 5, 7, 9-18, and 20 are considered for the experimental validation. The remaining sequences are less common, each having <400 sequences in the data set.

The discontinuous peptides were generated and the variability was investigated for all cross-reactive nAbs (**Table 4**). The B-cell epitope regions on the HA stem are less variable as compared to the epitopes on the HA head. The specific result generated within each subtype in HA sequence dataset show similar patterns as for all subtypes (data not shown). This conclusion is consistent with our previous knowledge that the globular head of HA1 has a higher mutation rate than the stem (29), making the stem a more conserved region for bnAbs targeting.

## **DISCONTINUOUS MOTIFS COVERAGE IN HA SEQUENCES DATASET**

The neutralized and escape discontinuous motifs of nAb F10 have covered 19 and 17% of FLUKB, respectively, while the discontinuous peptides from 64% of the strains have not been



<sup>2</sup>http://research4.dfci.harvard.edu/cvc/blocklogo

validated (**Figure 6A**). Viewed by the subtype, F10 neutralized coverage of subtypes H5, H8, H9, and H11 are higher (50–90%) than of H1 and H2 (5–20%), while the coverage of subtype H6 is negligible (8 in 1708 H6 sequences) (**Figure 6B**).

The motif coverage analysis within the 45,812 HA sequences was performed for all nAbs. For the nAbs with available crossreactivity data, the motif coverages were different between the nAbs targeting the HA globular head and those targeting the stem

 Table 4 |The number of different discontinuous peptides from B-cell

 epitopes of each nAb in the HA sequence dataset.

Neutralizing type	Neutra region	alizing epitope s	Neutralizing antibodies	Number of different discontinuous peptides		
Influenza A virus						
	Head	Sa site	2D1	2,190		
		Near RBS	1F1	2,887		
			2G1	2,127		
			8F8	2,885		
			8M2	3,290		
			C05	3,020		
			CH65	2,727		
			CH67	2,773		
			S139/1	3,070		
	Stem	F subdomain	39.29	983		
			C179	755		
			CR6261	658		
			CR9114	663		
			F10	589		
			FI6v3	905		
		Stem base	CR8020	620		
Influenza B virus						
	Head base		CR8071	848		

part. The nAbs that bind stem normally have higher neutralized motif coverage than those that bind the globular head (**Figure 7**).

The motif coverage is shown as heat map for each subtype and each nAb (**Figure 8**). The nAbs (such as CR6261, CR9114, F10, and FI6v3) that target stem region are more cross-reactive – they cover more strains, and also more subtypes of influenza.

### **COMBINING OF NEUTRALIZING ANTIBODIES**

For each sequence in the HA sequence dataset, 22 strings (discontinuous peptides) were extracted to represent 22 B-cell epitopes by all nAbs analyzed in this study. The majority (82.62%) of all strains in FLUKB have at least one discontinuous peptide that is identical to the validated neutralized motifs (**Table 5**). A small number (2.25%) of sequences can be neutralized by as many as seven nAbs.

Here, we propose a combination of nAbs, where a small number of nAbs can cover a large proportion of influenza strains. The nAbs FI6v3, F10, CR9114, and CR8071 (**Figure 9A**) were selected, and the neutralized coverage has increased from 18.91% (F10), 4.06% (CR8071), 43.89% (CR9114), and 58.44% (FI6v3) to 78.45% (**Figure 9B**) when these antibodies were combined. These nAbs also covered most subtypes of influenza A virus and both lineages in influenza B virus (**Figure 9C**).

## DISCUSSION

This study presents an overview of binding specificities of reported nAbs, as well as an estimate of their neutralization and escape coverage (neutralization effectiveness) in more than 45,000 HA sequences available in FLUKB. The variety and frequency of discontinuous peptides within different B-cell epitopes have been analyzed in the HA data set. The results of the analysis of discontinuous peptides provide insights into further experimental design: strains with peptides that have high frequency among the strain populations should be given priority for experimental validation and their neutralizing status for specific nAbs.

Of note, additional sequence changes in HA outside the nAb epitope may result in either local or quaternary structural alterations that impacts antibody binding to the epitope *per se*.





FIGURE 7 | Discontinuous motif coverage in the HA sequence dataset for cross-reactive nAbs. Only the coverage data for cross-reactive nAbs are shown here. The nAbs are grouped based on their binding locations and influenza types, from left to right: Sa site, near RBS, F subdomain, stem base on influenza A virus, and head base on influenza B virus.





Likewise, modification of glycosylation sites through sequence change may impact accessibility of antibodies to the neutralization site, creating discordance between sequence identity of binding site shown in BlockLogo and neutralization outcome between two strains of viruses sharing the same epitope sequence. The frequency of such occurrences will be important to determine. Neutralization assays of strains with discontinuous epitopes identical to validated B-cell epitopes will provide a proof of cross-neutralization. Since the experimental validation is time and money consuming, the introduction of extended B-cell epitope (see Supplementary Material) aims to help select representative sequences that differ in extended B-cell epitopes. For each proposed neutralizing or escape peptide (actual B-cell epitope), a small number of variants defined by changes in its environment (extended B-cell epitopes) constitute the majority of strains with the proposed peptide.

On the other hand, before more experimental data generated to fill the existing "non-validated gap," it will be meaningful to bring out some reasonable estimation. The assumption and methods in this paper are based on complete identity to discontinuous motifs on B-cell epitope (additionally extended B-cell epitope). To check the validity of this assumption, the similarity between discontinuous motifs and discontinuous peptides could be used

 Table 5 | Distribution of the number of neutralizing antibodies that

 share identical neutralized discontinuous motif with sequences

 within the HA sequence dataset.

Number of nAbs	Coverage in 45,812 HA dataset (%)
0	17.38
1	12.45
2	11.68
3	13.39
4	31.38
5	1.59
6	9.89
7	2.25

For each sequence within the 45,812 HA dataset, the number of nAbs that share identical neutralized motif was counted. The number of nAbs in our panel for any given influenza strain can range from 0 to 7.

to estimate and predict neutralization and binding results in the future. For example, a discontinuous peptide with mutated residues of similar feature to the neutralized motif would be considered as "possible neutralized peptide" against specific nAbs. These estimations could also be validated in experimental assays, and then be used to further experimental design iteratively.

## **CONCLUSION**

Over the past few years, our understanding of nAbs and their responses against influenza HA have expanded tremendously. Besides the well-known HA head region interactions, an increasing number of characterized nAbs bind and neutralize influenza virus by targeting the more conserved stem regions. Among these stemtargeting nAbs, some show broadly neutralizing ability across subtypes/lineages, even across two groups in influenza A virus strains. However, the related experimental data for majority of nAbs are quite limited.

In sum, we have established a library of validated motifs (extracted from HA sequences in neutralized and escape strains) for each nAb. For any newly emerging strain, the cross-neutralization prediction can be made rapidly for existing nAbs and validation experiments can be designed judiciously. This study provides a method for investigation of cross-reactivity of nAbs against influenza viruses, but is directly applicable to any viral pathogen that has structurally characterized nAbs and a collection of variant sequences of the target antigen. Examples of such pathogens include orthomyxoviruses (influenza); flaviviruses such as dengue or West Nile; arenaviruses such as



lymphocytic choriomeningitis virus and human immunodeficiency virus, among others. Insights from such bioinformatics analyses coupled with antibody antigenicity through crystallographic determinations will facilitate electronic neutralization profiling that can be tested empirically in subsequent laboratory neutralization assays.

### **ACKNOWLEDGMENTS**

Jing Sun, Vladimir Brusic, and Ellis L. Reinherz acknowledge funding from NIH grant U01 AI 90043. Ulrich J. Kudahl was funded by Oticon Foundation, Otto Mønsted Foundation, Julie Dam's Stipend, Henry Shaws Stipend, and Reinholdt Jorcks Stipend. Christian Simon was funded by the Novo Scholarship Programme, Direktør Ib Henriksens Fond, and Augustinus Fonden.

### **SUPPLEMENTARY MATERIAL**

The Supplementary Material for this article can be found online at http://www.frontiersin.org/Journal/10.3389/fimmu.2014.00038/ abstract

### **REFERENCES**

- Thompson WW, Shay DK, Weintraub E, Brammer L, Cox N, Anderson LJ, et al. Mortality associated with influenza and respiratory syncytial virus in the United States. *JAMA* (2003) 289(2):179–86. doi:10.1001/jama.289.2.179
- Parvin JD, Moscona A, Pan WT, Leider JM, Palese P. Measurement of the mutation rates of animal viruses: influenza A virus and poliovirus type 1. *J Virol* (1986) 59(2):377–83.
- Fraser C, Donnelly CA, Cauchemez S, Hanage WP, Van Kerkhove MD, Hollingsworth TD, et al. Pandemic potential of a strain of influenza A (H1N1): early findings. *Science* (2009) 324(5934):1557–61. doi:10.1126/science.1176062
- Wiley DC, Skehel JJ. The structure and function of the hemagglutinin membrane glycoprotein of influenza virus. *Annu Rev Biochem* (1987) 56:365–94. doi:10.1146/annurev.bi.56.070187.002053
- Nakamura G, Chai N, Park S, Chiang N, Lin Z, Chiu H, et al. An in vivo humanplasmablast enrichment technique allows rapid identification of therapeutic influenza a antibodies. *Cell Host Microbe* (2013) 14(1):93–103. doi:10.1016/j. chom.2013.06.004
- Steel J, Lowen AC, Wang TT, Yondola M, Gao Q, Haye K, et al. Influenza virus vaccine based on the conserved hemagglutinin stalk domain. *MBio* (2010) 1(1):e18–10. doi:10.1128/mBio.00018-10
- Okuno Y, Isegawa Y, Sasao F, Ueda S. A common neutralizing epitope conserved between the hemagglutinins of influenza A virus H1 and H2 strains. *J Virol* (1993) 67(5):2552–8.
- Yoshida R, Igarashi M, Ozaki H, Kishida N, Tomabechi D, Kida H, et al. Crossprotective potential of a novel monoclonal antibody directed against antigenic site B of the hemagglutinin of influenza A viruses. *PLoS Pathog* (2009) 5(3):e1000350. doi:10.1371/journal.ppat.1000350
- 9. Ueda M, Maeda A, Nakagawa N, Kase T, Kubota R, Takakura H, et al. Application of subtype-specific monoclonal antibodies for rapid detection and identification of influenza A and B viruses. *J Clin Microbiol* (1998) **36**(2):340–4.
- Smirnov YA, Lipatov AS, Gitelman AK, Claas EC, Osterhaus AD. Prevention and treatment of bronchopneumonia in mice caused by mouse-adapted variant of avian H5N2 influenza A virus using monoclonal antibody against conserved epitope in the HA stem region. *Arch Virol* (2000) 145(8):1733–41. doi:10.1007/s007050070088
- 11. Sakabe S, Iwatsuki-Horimoto K, Horimoto T, Nidom CA, Le M, Takano R, et al. A cross-reactive neutralizing monoclonal antibody protects mice from H5N1 and pandemic (H1N1) 2009 virus infection. *Antiviral Res* (2010) 88(3):249–55. doi:10.1016/j.antiviral.2010.09.007
- Ekiert DC, Wilson IA. Broadly neutralizing antibodies against influenza virus and prospects for universal therapies. *Curr Opin Virol* (2012) 2(2):134–41. doi:10.1016/j.coviro.2012.02.005
- 13. Sui J, Hwang WC, Perez S, Wei G, Aird D, Chen LM, et al. Structural and functional bases for broad-spectrum neutralization of avian and human

influenza A viruses. *Nat Struct Mol Biol* (2009) **16**(3):265–73. doi:10.1038/nsmb. 1566

- Corti D, Voss J, Gamblin SJ, Codoni G, Macagno A, Jarrossay D, et al. A neutralizing antibody selected from plasma cells that binds to group 1 and group 2 influenza A hemagglutinins. *Science* (2011) 333(6044):850–6. doi:10.1126/ science.1205669
- Yamashita M, Krystal M, Fitch WM, Palese P. Influenza B virus evolution: co-circulating lineages and comparison of evolutionary pattern with those of influenza A and C viruses. *Virology* (1988) 163(1):112–22. doi:10.1016/0042-6822(88)90238-3
- Rota PA, Wallis TR, Harmon MW, Rota JS, Kendal AP, Nerome K. Cocirculation of two distinct evolutionary lineages of influenza type B virus since 1983. *Virology* (1990) 175(1):59–68. doi:10.1016/0042-6822(90)90186-U
- Dreyfus C, Laursen NS, Kwaks T, Zuijdgeest D, Khayat R, Ekiert DC, et al. Highly conserved protective epitopes on influenza B viruses. *Science* (2012) 337(6100):1343–8. doi:10.1126/science.1222908
- Huang J, Honda W. CED: a conformational epitope database. BMC Immunol (2006) 7:7. doi:10.1186/1471-2172-7-7
- Squires RB, Noronha J, Hunt V, Garcia-Sastre A, Macken C, Baumgarth N, et al. Influenza research database: an integrated bioinformatics resource for influenza research and surveillance. *Influenza Other Respir Viruses* (2012) 6(6):404–16. doi:10.1111/j.1750-2659.2011.00331.x
- Tsibane T, Ekiert DC, Krause JC, Martinez O, Crowe JE Jr, Wilson IA, et al. Influenza human monoclonal antibody 1F1 interacts with three major antigenic sites and residues mediating human receptor specificity in H1N1 viruses. *PLoS Pathog* (2012) 8(12):e1003067. doi:10.1371/journal.ppat.1003067
- Xu R, Ekiert DC, Krause JC, Hai R, Crowe JE Jr, Wilson IA. Structural basis of preexisting immunity to the 2009 H1N1 pandemic influenza virus. *Science* (2010) **328**(5976):357–60. doi:10.1126/science.1186430
- Fleury D, Daniels RS, Skehel JJ, Knossow M, Bizebard T. Structural evidence for recognition of a single epitope by two distinct antibodies. *Proteins* (2000) 40(4):572–8. doi:10.1002/1097-0134(20000901)40:4<572::AID-PROT30>3.3. CO;2-E
- Ekiert DC, Kashyap AK, Steel J, Rubrum A, Bhabha G, Khayat R, et al. Crossneutralization of influenza A viruses mediated by a single antibody loop. *Nature* (2012) 489(7417):526–32. doi:10.1038/nature11414
- 24. Whittle JR, Zhang R, Khurana S, King LR, Manischewitz J, Golding H, et al. Broadly neutralizing human antibody that recognizes the receptor-binding pocket of influenza virus hemagglutinin. *Proc Natl Acad Sci U S A* (2011) 108(34):14216–21. doi:10.1073/pnas.1111497108
- 25. Schmidt AG, Xu H, Khan AR, O'Donnell T, Khurana S, King LR, et al. Preconfiguration of the antigen-binding site during affinity maturation of a broadly neutralizing influenza virus antibody. *Proc Natl Acad Sci U S A* (2013) **110**(1):264–9. doi:10.1073/pnas.1218256109
- Bizebard T, Gigant B, Rigolet P, Rasmussen B, Diat O, Bosecke P, et al. Structure of influenza virus haemagglutinin complexed with a neutralizing antibody. *Nature* (1995) 376(6535):92–4. doi:10.1038/376092a0
- Fleury D, Barrere B, Bizebard T, Daniels RS, Skehel JJ, Knossow M. A complex of influenza hemagglutinin with a neutralizing antibody that binds outside the virus receptor binding site. *Nat Struct Biol* (1999) 6(6):530–4. doi:10.1038/9299
- Barbey-Martin C, Gigant B, Bizebard T, Calder LJ, Wharton SA, Skehel JJ, et al. An antibody that prevents the hemagglutinin low pH fusogenic transition. *Virology* (2002) **294**(1):70–4. doi:10.1006/viro.2001.1320
- 29. Lee PS, Yoshida R, Ekiert DC, Sakai N, Suzuki Y, Takada A, et al. Heterosubtypic antibody recognition of the influenza virus hemagglutinin receptor binding site enhanced by avidity. *Proc Natl Acad Sci U S A* (2012) **109**(42):17040–5. doi:10.1073/pnas.1212371109
- Dreyfus C, Ekiert DC, Wilson IA. Structure of a classical broadly neutralizing stem antibody in complex with a pandemic H2 influenza virus hemagglutinin. *J Virol* (2013) 87(12):7149–54. doi:10.1128/JVI.02975-12
- 31. Throsby M, van den Brink E, Jongeneelen M, Poon LL, Alard P, Cornelissen L, et al. Heterosubtypic neutralizing monoclonal antibodies cross-protective against H5N1 and H1N1 recovered from human IgM+ memory B cells. *PLoS One* (2008) 3(12):e3942. doi:10.1371/journal.pone.0003942
- 32. Ekiert DC, Bhabha G, Elsliger MA, Friesen RH, Jongeneelen M, Throsby M, et al. Antibody recognition of a highly conserved influenza virus epitope. *Science* (2009) **324**(5924):246–51. doi:10.1126/science.1171491

- Ekiert DC, Friesen RH, Bhabha G, Kwaks T, Jongeneelen M, Yu W, et al. A highly conserved neutralizing epitope on group 2 influenza A viruses. *Science* (2011) 333(6044):843–50. doi:10.1126/science.1204839
- 34. Sun X, Shi Y, Lu X, He J, Gao F, Yan J, et al. Bat-derived influenza hemagglutinin H17 does not bind canonical avian or human receptors and most likely uses a unique entry mechanism. *Cell Rep* (2013) **3**(3):769–78. doi:10.1016/j.celrep. 2013.01.025
- Larkin MA, Blackshields G, Brown NP, Chenna R, McGettigan PA, McWilliam H, et al. Clustal W and Clustal X version 2.0. *Bioinformatics* (2007) 23(21):2947–8. doi:10.1093/bioinformatics/btm404
- Page RD. TreeView: an application to display phylogenetic trees on personal computers. *Comput Appl Biosci* (1996) 12(4):357–8.
- Berman HM, Westbrook J, Feng Z, Gilliland G, Bhat TN, Weissig H, et al. The protein data bank. *Nucleic Acids Res* (2000) 28(1):235–42. doi:10.1093/nar/28. 1.235
- Katz J, Hancock K, Veguilla V, Zhong W, Lu X, Sun H, et al. Serum crossreactive antibody response to a novel influenza A (H1N1) virus after vaccination with seasonal influenza vaccine. *MMWR Morb Mortal Wkly Rep* (2009) 58(19):521–4.
- Stavitsky AB. Micromethods for the study of proteins and antibodies II. Specific applications of hemagglutination and hemagglutination-inhibition reactions with tannic acid and protein-treated red blood cells. *J Immunol* (1954) 72(5):368–75.
- Yu X, Tsibane T, McGraw PA, House FS, Keefer CJ, Hicar MD, et al. Neutralizing antibodies derived from the B cells of 1918 influenza pandemic survivors. *Nature* (2008) 455(7212):532–6. doi:10.1038/nature07231
- Krause JC, Tumpey TM, Huffman CJ, McGraw PA, Pearce MB, Tsibane T, et al. Naturally occurring human monoclonal antibodies neutralize both 1918 and 2009 pandemic influenza A (H1N1) viruses. J Virol (2010) 84(6):3127–30. doi:10.1128/JVI.02184-09
- Katoh K, Toh H. Recent developments in the MAFFT multiple sequence alignment program. Brief Bioinform (2008) 9(4):286–98. doi:10.1093/bib/bbn013
- Altschul SF, Madden TL, Schaffer AA, Zhang J, Zhang Z, Miller W, et al. Gapped BLAST and PSI-BLAST: a new generation of protein database search programs. *Nucleic Acids Res* (1997) 25(17):3389–402. doi:10.1093/nar/25.17.3389

- Hubbard SJ, Thornton JM. Naccess. Computer Program. (Vol. 2). London: Department of Biochemistry and Molecular Biology, University College London (1993).
- McConkey BJ, Sobolev V, Edelman M. Discrimination of native protein structures using atom-atom contact scoring. *Proc Natl Acad Sci U S A* (2003) 100(6):3215–20. doi:10.1073/pnas.0535768100
- Krissinel E, Henrick K. Inference of macromolecular assemblies from crystalline state. J Mol Biol (2007) 372(3):774–97. doi:10.1016/j.jmb.2007.05.022
- Wilson IA, Skehel JJ, Wiley DC. Structure of the haemagglutinin membrane glycoprotein of influenza virus at 3 A resolution. *Nature* (1981) 289(5796):366–73. doi:10.1038/289366a0
- Crooks GE, Hon G, Chandonia JM, Brenner SE. WebLogo: a sequence logo generator. *Genome Res* (2004) 14(6):1188–90. doi:10.1101/gr.849004
- Olsen LR, Kudahl UJ, Simon C, Sun J, Schönbach C, Reinherz EL, et al. Block-Logo: Visualization of peptide and sequence motif conservation. *J Immunol Methods* (2013) 400:37–44. doi:10.1016/j.jim.2013.08.014

**Conflict of Interest Statement:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

Received: 05 September 2013; accepted: 22 January 2014; published online: 07 February 2014.

Citation: Sun J, Kudahl UJ, Simon C, Cao Z, Reinherz EL and Brusic V (2014) Large-scale analysis of B-cell epitopes on influenza virus hemagglutinin – implications for cross-reactivity of neutralizing antibodies. Front. Immunol. 5:38. doi: 10.3389/fimmu.2014.00038

This article was submitted to B Cell Biology, a section of the journal Frontiers in Immunology.

Copyright © 2014 Sun, Kudahl, Simon, Cao, Reinherz and Brusic. This is an openaccess article distributed under the terms of the Creative Commons Attribution License (CC BY). The use, distribution or reproduction in other forums is permitted, provided the original author(s) or licensor are credited and that the original publication in this journal is cited, in accordance with accepted academic practice. No use, distribution or reproduction is permitted which does not comply with these terms.