



# Stability-Diversity Tradeoffs Impose Fundamental Constraints on Selection of Synthetic Human $V_H/V_L$ Single-Domain Antibodies from *In Vitro* Display Libraries

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Human autonomous  $V_H/V_L$  single-domain antibodies (sdAbs) are attractive therapeutic molecules, but often suffer from suboptimal stability, solubility and affinity for cognate antigens. Most commonly, human sdAbs have been isolated from *in vitro* display libraries constructed *via* synthetic randomization of rearranged  $V_H/V_L$  domains. Here, we describe the design and characterization of three novel human  $V_H/V_L$  sdAb libraries through a process of: (i) exhaustive biophysical characterization of 20 potential  $V_H/V_L$  sdAb library scaffolds, including assessment of expression yield, aggregation resistance, thermostability and tolerance to complementarity-determining region (CDR) substitutions; (ii) *in vitro* randomization of the CDRs of three  $V_H/V_L$  sdAb scaffolds, with tailored amino acid representation designed to promote solubility and expressibility; and (iii) systematic benchmarking of the three  $V_H/V_L$  libraries by panning against five model antigens. We isolated  $\geq 1$  antigen-specific human sdAb against four of five targets (13  $V_H$ s and 7  $V_L$ s in total); these were predominantly monomeric, had antigen-binding affinities ranging from 5 nM to 12  $\mu$ M (average: 2–3  $\mu$ M), but had highly variable expression yields (range: 0.1–19 mg/L). Despite our efforts to identify the most stable  $V_H/V_L$  scaffolds, selection of antigen-specific binders from these libraries was unpredictable (overall success rate for all library-target screens: ~53%) with a high attrition rate of sdAbs exhibiting false positive binding by ELISA. By analyzing  $V_H/V_L$  sdAb library sequence composition following selection for monomeric antibody expression (binding to protein A/L followed by amplification in bacterial cells), we found that some  $V_H/V_L$  sdAbs had marked growth advantages over others, and that the amino acid composition of the CDRs of this set of sdAbs was dramatically restricted (bias toward Asp and His and away from aromatic and hydrophobic residues). Thus, CDR sequence clearly dramatically impacts the stability of human autonomous  $V_H/V_L$  immunoglobulin domain folds, and sequence-stability tradeoffs must be taken into account during the design of such libraries.

**Keywords:** single-domain antibody, synthetic antibody, human  $V_H/V_L$ , phage display, protein engineering

## INTRODUCTION

The concept of an autonomous single immunoglobulin variable domain (single-domain antibodies or sdAbs) as the smallest representation of an antigen-binding-competent antibody was first described by Ward et al. in the mouse (1). With the discovery of naturally occurring heavy chain-only antibodies in *Camelidae* (2) and in cartilaginous sharks (3) several years later (the single variable domains of which can recognize antigen autonomously), it became clear that sdAbs represented not only a theoretical possibility but a viable immunological solution to the problem of antigen recognition. Although the human humoral immune system produces only conventional antibodies with paired heavy and light chains and not sdAbs, the question of whether human sdAbs (autonomous variable heavy- or light-chain domains, V<sub>HS</sub> or V<sub>LS</sub>) could be isolated and/or molecularly engineered *in vitro* was brought to light.

The identification, engineering and biophysical characterization of a handful of non-antigen-specific human V<sub>H</sub>/V<sub>L</sub> sdAbs has been extensively reported and discussed (4). The first efforts to produce human V<sub>H</sub>/V<sub>L</sub> sdAbs with novel antigen-binding specificities used “camelized” scaffolds that incorporated the solubilizing framework region (FR) substitutions found in camelid sdAbs (5–9). Although this approach yielded antigen-specific sdAbs with excellent solubility and biophysical properties, it relied on undesirable sequence deviation from the human IGHV germline. Later, rare fully human rearranged V<sub>H</sub> and V<sub>L</sub> variable domains were discovered that were autonomously stable and monomeric and large phage display libraries were constructed by randomizing their complementarity-determining regions (CDRs), although it was clear from the mid-2000s that certain CDR sequences (potentially low in hydrophobic content and rich in negative charge) were better compatible with solubility and stability of these molecules (9–11). There are now many examples of fully human antibodies (primarily V<sub>HS</sub>) isolated from

such libraries against a variety of targets, including  $\alpha$ -amylase (12),  $\beta$ -galactosidase (13, 14), *Candida albicans* MP65 and SAP-2 (15), carbonic anhydrase (12), CD154 (16), CD28 (17), CD40 (18, 19), CD40L (20), *Clostridium difficile* toxin B (21), EGFR (22), glypican-2 (23), glypican-3 (24), human serum albumin (HSA) (25–27), lysozyme (28–30), maltose-binding protein (31), MDM4 (32), mesothelin (33), TNF- $\alpha$  (34), TNFR1 (35), and VEGF (22). These fully human V<sub>H</sub>/V<sub>L</sub> sdAbs exhibit a variety of antigen-binding modes and functional activities and several have entered clinical development, where they have been generally well-tolerated albeit unexpectedly immunogenic (36, 37).

Here, we report the design, construction and characterization of three novel phage-displayed, synthetically randomized human V<sub>H</sub>/V<sub>L</sub> sdAb libraries. We attempted to circumvent the unfavorable biophysical properties of many human V<sub>H</sub>/V<sub>L</sub> sdAbs by (i) selecting ultra-stable V<sub>H</sub>/V<sub>L</sub> sdAbs tolerant to CDR modification as library scaffolds, (ii) maximizing randomized sequence diversity in CDRs using trinucleotide mutagenesis, and (iii) spiking the library with negatively charged residues to encourage solubility. Similarly to the experiences of others, we were able to isolate monomeric, high-affinity V<sub>H</sub>/V<sub>L</sub> sdAbs from the libraries against some antigens but not against others. The stochastic process of selecting binders from human V<sub>H</sub>/V<sub>L</sub> sdAb libraries is likely a consequence of fundamental tradeoffs between CDR sequence and human V<sub>H</sub>/V<sub>L</sub> sdAb stability and aggregation resistance.

## MATERIALS AND METHODS

### Identification of Human Autonomous V<sub>H</sub>/V<sub>L</sub> sdAb Scaffolds

The human autonomous V<sub>H</sub> and V<sub>L</sub> sdAb scaffolds used in this study (Table 1; Figure S1 in Supplementary Material) were

**TABLE 1** | Properties of human V<sub>H</sub> and V<sub>L</sub> single-domain antibody scaffolds used in this study.

Type	Scaffold <sup>a</sup>	Disulfide linkages <sup>b</sup>	Germline rearrangement	CDR3 length (aa)	T <sub>m</sub> (°C)	Monomer (%)	Reference	
V <sub>L</sub>	VL383	23–104	IGKV3-20-IGKJ2	9	57.3	>95	(39)	
	VL383 <sub>SS</sub>	23–104, 54–78	IGKV3-20-IGKJ2	9	73.7	85.3		
	VL382	23–104	IGKV3-20-IGKJ1	9	70.1	>95	(39)	
	VL382 <sub>SS</sub>	23–104, 54–78	IGKV3-20-IGKJ1	9	83.3	>95		
	VL335	23–104	IGKV3-20-IGKJ1	9	61.7	>95	(39)	
	VL335 <sub>SS</sub>	23–104, 54–78	IGKV3-20-IGKJ1	9	79.0	>95	(39)	
	VL330	23–104	IGKV1-39-IGKJ2	9	62.8	>95	(39)	
	VL330 <sub>SS</sub>	23–104, 54–78	IGKV1-39-IGKJ2	9	83.7	>95		
	VL325	23–104	IGKV3-11-IGKJ4	9	68.5	>95	(39)	
	VL325 <sub>SS</sub>	23–104, 54–78	IGKV3-11-IGKJ4	9	82.5	>95	(39)	
	V <sub>H</sub>	VH420	23–104	IGHV3-15-IGHJ4	10	57.8	>95	(38)
		VH420 <sub>SS</sub>	23–104, 54–78	IGHV3-15-IGHJ4	10	67.3	>95	
		VH428	23–104	IGHV3-49-IGHJ4	14	62.3	>95	(38)
		VH428 <sub>SS</sub>	23–104, 54–78	IGHV3-49-IGHJ4	14	73.1	>95	
VH429		23–104	IGHV3-23-IGHJ4	12	58.5	>95	(38)	
VH429 <sub>SS</sub>		23–104, 54–78	IGHV3-23-IGHJ4	12	71.8	>95		
VHB82		23–104	IGHV3-23-IGHJ6	6	57.9	>95	(38)	
VHB82 <sub>SS</sub>		23–104, 54–78	IGHV3-23-IGHJ6	6	72.9	80.8		
VHM81		23–104	IGHV3-23-IGHJ3	14	66.9	>95	(38)	
VHM81 <sub>SS</sub>		23–104, 54–78	IGHV3-23-IGHJ3	14	76.8	>95		

<sup>a</sup>Full-length amino acid sequences are listed in Figure S1 in Supplementary Material.

<sup>b</sup>IMGT numbering.

isolated as previously described by To et al. (38) and Kim et al. (39). Disulfide-stabilized versions of each V<sub>H</sub>/V<sub>L</sub> sdAb (bearing an intradomain disulfide linkage formed between Cys residues at IMGT positions 54 and 78) were produced by overlap extension PCR as described in Kim et al. (40).

## CDR Shuffling

All three CDRs of each V<sub>H</sub>/V<sub>L</sub> scaffold were simultaneously exchanged for those listed in **Table 2** (20 V<sub>H</sub>/V<sub>L</sub> scaffolds × 12 CDR sets = 240 CDR-shuffled variants). DNA constructs encoding the CDR-shuffled variants were synthesized commercially (GeneArt/Life Technologies, Regensburg, Germany) and subcloned into the pSjF2H bacterial expression vector (12).

## Design and Construction of Synthetic Human V<sub>H</sub>/V<sub>L</sub> sdAb Phage Display Libraries

Three phage-displayed sdAb libraries were constructed by *in vitro* randomization of the sdAb scaffolds VH428, VHB82<sub>SS</sub> and VL383<sub>SS</sub>. Briefly, nondegenerate oligonucleotides spanning each sdAb were chemically synthesized using the phosphoramidite method (GeneArt/Life Technologies) and purified by HPLC. CDRs were randomized *via* incorporation of defined mixtures of trinucleotide phosphoramidite building blocks (41) during oligonucleotide synthesis. Oligonucleotides were

assembled without amplification by Klenow fragment extension, gel purified using a GeneJET™ gel extraction kit (Thermo-Fisher, Waltham, MA, USA) according to the manufacturer's instructions, and resuspended in a total volume of 1 mL TE buffer (10 mM Tris-HCl, 1 mM EDTA, pH 8.0). Non-amplified library DNA was quantified by real-time PCR using Fast SYBR™ Green master mix (Thermo-Fisher), and a StepOnePlus™ real-time PCR system (Thermo-Fisher), then approximately 232–1,069 ng (4.3 × 10<sup>11</sup> to 1.5 × 10<sup>12</sup> molecules) of DNA was PCR-amplified with Phusion® high-fidelity DNA polymerase (Thermo-Fisher) using M13F and M13R primers (sequences in Table S1 in Supplementary Material), gel purified using a GeneJET™ gel extraction kit, then digested and ligated between the *Nco*I and *Not*I sites of the phagemid vector pMED1 (42). *Escherichia coli* TG1 cells were transformed with the ligation products by electroporation, yielding final library sizes between 1.0 × 10<sup>10</sup> and 2.3 × 10<sup>10</sup> independent transformants, ≥95% of which carried V<sub>H</sub>/V<sub>L</sub> sdAb inserts as shown by colony PCR.

## Antibodies, Proteins and Reagents

Recombinant human CEACAM6 (residues 145–232) and mouse GTR (residues 20–153) ectodomains were produced by transient transfection of HEK293-6E cells as previously described (43). HSA was from Sigma-Aldrich (St. Louis, MO, USA; Cat. No. A9511).

**TABLE 2** | Amino acid sequences of complementarity-determining region (CDR) sets introduced into human V<sub>H</sub>/V<sub>L</sub> single-domain antibody (sdAb) scaffolds for biophysical stability assessment.

V <sub>L</sub> CDR set	CDR-L1 <sup>a</sup>	CDR-L2 <sup>b</sup>	CDR-L3 <sup>c</sup>	CDR-L3 length (aa)
1	RASQSVLVHLA	GDSYRAD	QQTFYPST	8
2	RASQSVISNLA	GDSFRAF	QQVAHPTT	8
3	RASQSVTDTLA	GISHRAD	QQLVHPFT	8
4	RASQSVHNLA	GLSTRAH	QQFDHPYT	8
5	RASQSVSSNLA	GASLRAT	QQYLPPAT	9
6	RASQSVAPSLA	GTSTRAP	QQPTLFPPT	9
7	RASQSVNLPYLA	GVSTRAY	QQIAVTPYT	9
8	RASQSVDYNLA	DISFRAN	QQSLSPPAT	9
9	RASQSVNITSLA	GTSTRAD	QQTNTHHPVT	10
10	RASQSVSSYLA	GLSLRAV	QQTDSFFPPT	10
11	RASQSVPIVLA	GHSLRAD	QQLAFFDPPT	10
12	RASQSVVLNLA	GVSVRAD	QQILLFPHT	10
V <sub>H</sub> CDR set	CDR-H1 <sup>d</sup>	CDR-H2 <sup>e</sup>	CDR-H3 <sup>f</sup>	CDR-H3 length (aa)
1	SNAWMS	RITSKTDGGTTD	DQANAFDI	8
2	DGYAMH	VTNNGGSTS	QSITGPTGAFDI	12
3	SSYAMS	AISGGGDHTY	EGMVRGVSSAPFDY	14
4	ISESMT	AISSGGSTY	KKIDGARYDY	10
5	NLMSG	AVSRGGSTY	AATKSNTTAYRLSFDY	16
6	SMYRMG	VITRNGSSTY	TSGSSYLDAAHVYDY	15
7	SMDPMA	AGSSTGRTTY	APYGANWYRDEYAY	14
8	SRYPVA	VISSTGTSTY	NSQRTRLQDPNEYDY	15
9	SNRNMG	GISWGGGSTR	EFGHNIATSSDEYDY	15
10	NFYAMS	GVSVDGLTTL	VITGVWNKVDVNSRSYHY	18
11	SPTAMG	HITWSRGTTT	STFLRILPEESAYTY	15
12	DNYAMA	TIDWGDGGAR	ARQSRVNLVARYDY	15

<sup>a</sup>IMGT positions 24–40 in the acceptor sdAb were replaced with the indicated sequence.

<sup>b</sup>IMGT positions 56–69 in the acceptor sdAb were replaced with the indicated sequence.

<sup>c</sup>IMGT positions 105–117 in the acceptor sdAb were replaced with the indicated sequence.

<sup>d</sup>IMGT positions 35–40 in the acceptor sdAb were replaced with the indicated sequence.

<sup>e</sup>IMGT positions 55–66 in the acceptor sdAb were replaced with the indicated sequence.

<sup>f</sup>IMGT positions 105–117 in the acceptor sdAb were replaced with the indicated sequence.

Recombinant human CTLA4 ectodomain (residues 1–162) was from Sino Biological (Beijing, China; Cat. No. 11159-H08H). *E. coli* 0157:H7 intimin (residues 658–934) fused C-terminally to maltose-binding protein (MBP-intimin) was from GenScript (Piscataway, NJ, USA). Horseradish peroxidase-conjugated antibodies used in ELISA (mouse anti-M13, Cat. No. 27942101; mouse anti-c-Myc, Cat. No. 11814150001; rabbit anti-6 × His, Cat. No. A190-114P) were from GE Healthcare (Piscataway, NJ, USA), Bethyl Laboratories (Montgomery, TX, USA) and Roche Diagnostics (Basel, Switzerland), respectively. M13K07 helper phage was from New England BioLabs (Ipswich, MA, USA) and M13K07ΔpIII hyper phage was from Progen Biotechnik (Heidelberg, Germany).

## Isolation of Antigen-Specific Human $V_H/V_L$ sdAbs by Panning

Phage particles displaying monovalent  $V_H/V_L$  sdAbs were prepared by rescue of the three synthetic human  $V_H/V_L$  sdAb phagemid libraries with M13K07 helper phage as previously described (42). Briefly, 2 × YT broth (4 L) containing 1% (w/v) glucose and 100 μg/mL ampicillin was inoculated with 1 mL phagemid-bearing *E. coli* TG1 cells ( $7.3 \times 10^{10}$  to  $1.6 \times 10^{11}$ ) and grown at 37°C with 250 rpm shaking to an OD<sub>600</sub> of 0.5. Phagemid-bearing cells were superinfected with M13K07 helper phage at a multiplicity of infection of 20:1 at 37°C for 30 min with no shaking, then pelleted and resuspended in 6 L of 2 × YT broth containing 100 μg/mL ampicillin and 50 μg/mL kanamycin. The next day, phage particles were purified from bacterial supernatants using two rounds of polyethylene glycol precipitation; neither heat treatment nor filtration steps were used to remove residual bacterial cells. For panning, 5 μg of each protein in 35 μL phosphate-buffered saline (PBS), pH 7.4, was adsorbed overnight at 4°C in wells of NUNC MaxiSorp™ 96-well microtiter plates (Thermo-Fisher). The next day, wells were blocked with 200 μL PBS containing either 2% (w/v) bovine serum albumin (BSA) or 2% (w/v) skim milk for 1 h at 37°C, then rinsed 3 × with PBS. Approximately  $5 \times 10^{11}$  infective library phage particles ( $5 \times 10^{12}$  virions) were added to wells in 100 μL of PBS containing 1% BSA or skim milk and 0.1% (v/v) Tween-20 for 2 h at room temperature. The blocking protein (BSA and skim milk) was switched in alternate rounds of panning, except for panning on HSA in which only skim milk was used. Wells were washed 5 × with PBS containing 0.1% Tween-20, 2 × with PBS and then bound phage were eluted for 10 min with 50 μL of 100 mM triethylamine, neutralized with 50 μL 1 M Tris-HCl, pH 7.5, and used to reinfect exponentially growing *E. coli* TG1 cells. The cultures were superinfected with M13K07 helper phage. The next day, amplified phage were purified by polyethylene glycol precipitation from 10 mL overnight cultures and used in subsequent panning rounds. After four or five rounds of selection, antigen-specific  $V_H$ - or  $V_L$ -displaying phage clones were identified by their binding in polyclonal and monoclonal phage ELISA as previously described (42).

## Selection for Monomeric and Expressible Human $V_H/V_L$ sdAbs by Panning

Phage particles displaying monovalent  $V_H/V_L$  sdAbs were prepared by rescue of phagemid libraries with M13K07 helper phage

as described above. Phage particles displaying multivalent  $V_H/V_L$  sdAbs on all copies of pIII were prepared as described above, except that: (i) smaller volumes (100 mL) of 2 × YT broth were inoculated with 1 mL phagemid-bearing *E. coli* TG1 cells, (ii) phagemid libraries were rescued with M13K07ΔpIII hyper phage at a multiplicity of infection of 10:1, and (iii) the final overnight culture volume was 150 mL of 2 × YT broth.

For panning, 5 μg of either protein A (for the VHB82<sub>SS</sub> library; Thermo-Fisher) or protein L (for the VL383<sub>SS</sub> library; Thermo-Fisher) in 50 μL PBS, pH 7.4, was adsorbed overnight at 4°C in wells of NUNC MaxiSorp™ 96-well microtiter plates. The next day, wells were blocked with 300 μL PBS containing either 2% BSA or skim milk for 1 h at 37°C, then rinsed 1 × with PBS. Approximately  $10^{11}$  infective library phage particles ( $10^{12}$  virions) were added to wells in 100 μL of PBS containing 1% skim milk and 0.1% Tween-20 for 2 h at room temperature. Wells were washed 5 × with PBS containing 0.1% Tween-20, 2 × with PBS and then bound phage were eluted for 10 min with 50 μL of 100 mM triethylamine, neutralized with 50 μL 1 M Tris-HCl, pH 7.5, and used to reinfect exponentially growing *E. coli* TG1 cells. The cultures were superinfected with either M13K07 helper phage or M13K07ΔpIII hyper phage. The next day, amplified phage were purified by polyethylene glycol precipitation from 10 mL overnight cultures and used in subsequent panning rounds. After three rounds of selection, pools of sdAb-phage (either phage bound by and eluted from protein A/L, or phage amplified from overnight cultures) were interrogated using next-generation DNA sequencing (NGS) as described below.

## Soluble $V_H/V_L$ Protein Expression

Monomeric  $V_H/V_L$  sdAbs bearing C-terminal 6 × His and c-Myc tags were expressed from overnight cultures of *E. coli* TG1 cells grown in 250 mL to 1 L of 2 × YT broth under IPTG (isopropyl β-D-1-thiogalactopyranoside) induction, then extracted from periplasmic space by osmotic sucrose shock and purified by immobilized metal affinity chromatography as previously described (42). For small-scale expression screening, 5 mL overnight cultures were grown as above, lysed using FastBreak™ reagent (Promega, Madison, WI, USA) and sdAbs purified using PureProteome™ nickel magnetic beads (EMD Millipore, Billerica, MA, USA). Expression yields from 5 mL cultures were determined using the Bradford protein assay (Bio-Rad, Hercules, CA, USA) as per manufacturer's instructions with a  $V_H$  sdAb of known concentration as the protein standard. Titration ELISAs using soluble  $V_H/V_L$  sdAbs were performed as previously described (42, 44, 45), using either anti-6 × His or anti-c-Myc secondary antibodies to detect binding.

## Size Exclusion Chromatography (SEC) and SEC with Multiangle Light Scattering (MALS)

Size exclusion chromatography analyses of monomeric  $V_H/V_L$  sdAbs were conducted using a Superdex™ 75 GL column (GE Healthcare) connected to an ÄKTA FPLC protein purification system (GE Healthcare) as previously described (42). UPLC-SEC-MALS analyses of  $V_H/V_L$  sdAbs were conducted essentially

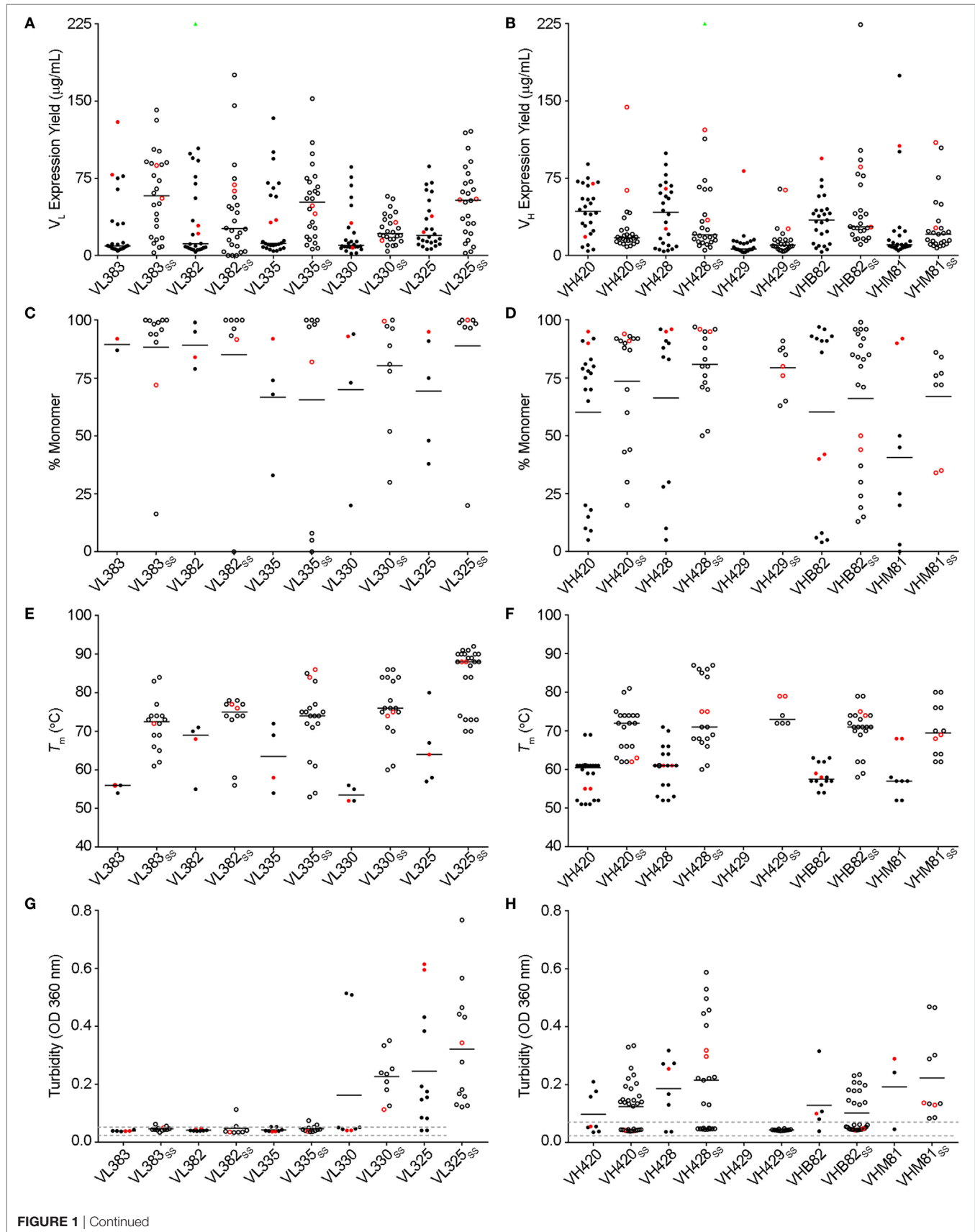


FIGURE 1 | Continued

**FIGURE 1** | Continued

Biophysical stability assessment of complementarity-determining region (CDR)-shuffled human  $V_H/V_L$  single-domain antibody (sdAb) variants. **(A,B)** Expression yields of CDR-shuffled  $V_L$  **(A)** and  $V_H$  **(B)** sdAbs from 5 mL overnight cultures, as determined by Bradford assay. Two outliers (VL382 + CDR set 9, expression yield 467.7  $\mu\text{g}/\text{mL}$  and VH428<sub>SS</sub> + CDR set 2, 356.4  $\mu\text{g}/\text{mL}$ ) are indicated by green triangles. **(C,D)** Aggregation tendencies of CDR-shuffled  $V_L$  **(C)** and  $V_H$  **(D)** sdAbs, as determined by SEC-MALS. **(E,F)** Melting temperatures ( $T_m$ s) of CDR-shuffled  $V_L$  **(E)** and  $V_H$  **(F)** sdAbs, as determined by thermal shift assay. **(G,H)** Turbidity upon thermal denaturation of CDR-shuffled  $V_L$  **(G)** and  $V_H$  **(H)** sdAbs, as measured by spectrophotometry at 360 nm wavelength. Dashed lines represent the range of turbidity measurements for unheated  $V_H/V_L$  sdAbs. The aggregation tendencies,  $T_m$ s and turbidities of CDR-shuffled variants of VH429 were not characterized due to inadequate expression yields. Horizontal lines represent mean **(C,D,G,H)** or median **(A,B,E,F)** values and wild-type  $V_H/V_L$  sdAbs with unmodified CDRs are shown in red. Open and solid circles represent  $V_H/V_L$  sdAbs with, or without, a stabilizing exogenous disulfide linkage. The number of data points in each panel reflects whether the experiment was conducted in singlicate **(C,E)** or duplicate **(A,B,D,F-H)** and for panels **(C-H)**, whether the CDR-shuffled variant expressed sufficiently for analysis.

as previously described (39) using an Acquity BEH-125 column (Waters, Milford, MA) connected to an Acquity UPLC H-Class Bio system (Waters) with miniDAWN<sup>TM</sup> MALS detector and Optilab<sup>®</sup> UT-rEX<sup>TM</sup> refractometer (Wyatt Technology, Santa Barbara, CA, USA).  $V_H/V_L$  sdAbs (10–20  $\mu\text{g}$ ) were injected at 30°C in a mobile phase consisting of calcium- and magnesium-free DPBS (GE Healthcare) at a flow rate of 0.4 mL/min. Weighted average molecular mass ( $M_{\text{MALS}}$ ) was calculated using a protein concentration determined using  $A_{280}$  from the PDA detector with extinction coefficients calculated from amino acid sequences. Data were processed using ASTRA 6.1 software (Wyatt).

### Surface Plasmon Resonance (SPR)

All monomeric human  $V_H/V_L$  sdAbs were SEC-purified and buffer-exchanged into HBS-EP buffer (10 mM HEPES, 150 mM NaCl, 3 mM EDTA, 0.005% (v/v) surfactant P20, pH 7.4) prior to SPR analyses. All SPR analyses were performed on a Biacore<sup>TM</sup> 3000 instrument (GE Healthcare) at a temperature of 25°C. Briefly, proteins (CEACAM6, 370 resonance units (RUs); HSA, 1614 RUs; GITR, 796 RUs; MBP-intimin, 1536 RUs) were immobilized *via* amine coupling on research-grade CM5 sensor chips (GE Healthcare) in 10 mM acetate buffer, pH 4.0, according to the manufacturer's instructions.  $V_H/V_L$  sdAbs were injected at concentrations ranging from 1 nM to 10  $\mu\text{M}$ , at flow rates of 20–50  $\mu\text{L}/\text{min}$  and with contact time between 120 s and 300 s, then allowed to dissociate for 7–10 min. All surfaces were regenerated using 10 mM glycine, pH 1.5. Ethanolamine-blocked flow cells served as reference surfaces. The data were fitted to a 1:1 interaction model and binding affinities ( $K_D$ s) and/or kinetic parameters were determined either by steady-state analysis or by multicycle kinetic analysis using BIAevaluation 4.1 software (GE Healthcare).

Surface plasmon resonance analyses of two  $V_L$  sdAbs (VL<sub>SS-2</sub> and VL<sub>SS-5</sub>) against MBP-intimin were conducted as described above, except that 234 RUs of MBP-intimin were immobilized on a research-grade C1 sensor chip (GE Healthcare) *via* amine coupling in 10 mM acetate buffer, pH 4.5, according to the manufacturer's instructions. These two  $V_L$  sdAbs were injected in HBS-EP buffer containing either 150 or 500 mM NaCl with an extended contact time (600 s).

### Protein Turbidity Assays

$V_H/V_L$  sdAb samples (0.2 mL) in 1.5 mL microcentrifuge tubes were heated to 85°C in a heating block for 10 min, then allowed to cool to room temperature for 30 min. Absorbance at 360 nm was measured pre- and post-heat treatment in a quartz NanoQuant

Plate<sup>TM</sup> (Tecan, Männedorf, Switzerland) using an Infinite<sup>®</sup> M200 PRO microplate reader (Tecan).  $V_H/V_L$  sdAb concentrations were adjusted to 0.25 mg/mL in PBS prior to analysis.

### Thermal Shift Assays

$V_H/V_L$  sdAb samples (45  $\mu\text{L}$ ) in 96-well thin-wall optical plates (Bio-Rad) were mixed with 5  $\mu\text{L}$  SYPRO<sup>®</sup> Orange (diluted 1:100 from 5,000  $\times$  stock; Life Technologies, Carlsbad, CA, USA) and sealed with optical quality sealing tape (Bio-Rad). Using an iQ<sup>TM</sup> 5 real-time PCR system (Bio-Rad), a temperature ramp of 1°C/min was applied and thermal unfolding was monitored by measuring fluorescence at 0.5°C intervals as previously described (46, 47). The wavelengths for excitation and emission were 490 and 575 nm, respectively. Melting temperatures ( $T_m$ s) were calculated as the temperature at which the maximum rate of change in fluorescent signal ( $d(\text{RFU})/dt$ ) was achieved.  $V_H/V_L$  sdAb concentrations were adjusted to 1 mg/mL in PBS prior to analysis.

### Circular Dichroism

$T_m$ s were also determined by circular dichroism as previously described (39, 40). Ellipticity of  $V_H/V_L$  sdAbs (100  $\mu\text{g}/\text{mL}$ ) was measured at wavelengths between 205 and 210 nm in 100 mM sodium phosphate buffer, pH 7.4. Ellipticity measurements were normalized to a percentage scale and then  $T_m$ s were determined by plotting percent folded versus temperature and fitting the data to a Boltzmann distribution.

### Next-Generation DNA Sequencing

$V_H/V_L$  sdAb libraries were interrogated using an Illumina MiSeq instrument as described previously (44, 45, 48). Amplicons for NGS were prepared using FR1- and FR4-specific barcoded primers (sequences in Table S1 in Supplementary Material) using as template either phagemid DNA (~10 ng) or phage virions (~10<sup>6</sup> particles).

### Statistical Analyses

Descriptive statistics (mean, median) were used to describe datasets as described in figure legends. No inferential statistical tests were used.

## RESULTS

Antigen-specific human autonomous  $V_H/V_L$  sdAbs do not exist in nature, and are most commonly isolated from synthetically randomized *in vitro* display libraries. These molecules are notoriously unstable and aggregation prone (4), which probably negatively



**FIGURE 2 | Continued**

Design and construction of the VL383<sub>SS</sub>, VH428, and VHB82<sub>SS</sub> synthetic human V<sub>H</sub>/V<sub>L</sub> single-domain antibody (sdAb) libraries. **(A)** Design of the human V<sub>H</sub>/V<sub>L</sub> sdAb libraries. The parental V<sub>H</sub>/V<sub>L</sub> sdAb sequence is shown at top with IMGT numbering. Intradomain disulfide linkage-forming cysteine residues at positions 54 and 78 are shown in magenta. Randomization positions are highlighted in either red (no length polymorphism) or green (length polymorphism). Arabic numerals indicate the codon mixture (X1, X2, X3, X4, or X5) incorporated at each randomization position. **(B)** Expected amino acid frequencies at V<sub>H</sub>/V<sub>L</sub> sdAb library randomization positions. **(C)** Observed amino acid frequencies at V<sub>H</sub>/V<sub>L</sub> sdAb library randomization positions, measured from phagemid DNA isolated from *Escherichia coli* TG1 cells. Crossed-out cells indicate a frequency of <0.1%. **(D)** CDR3 length distributions of the V<sub>H</sub>/V<sub>L</sub> sdAb libraries. **(E)** Degree of randomized sequence diversity (Levenshtein distance, or number of amino acid changes with respect to the parental scaffold) in the V<sub>H</sub>/V<sub>L</sub> sdAb libraries. Analyses shown in **(C–E)** are representative of 7.7 × 10<sup>4</sup> to 7.9 × 10<sup>5</sup> sequences per library.

**TABLE 3 |** Attrition rates of human V<sub>H</sub>/V<sub>L</sub> single-domain antibodies (sdAbs) through isolation and characterization.

Library	Target	No. of binding sdAbs		
		Phage ELISA	Soluble ELISA	SPR
VL383 <sub>SS</sub>	CEACAM6	1	1	1
	CTLA4	4	0	
	GITR	0		
	HSA	2	0	
	MBP-intimin <sup>a</sup>	3, 5	2, 4	2, 4
		15 (100%)	7 (47%)	7 (47%)
VH428	CEACAM6	3	3	3
	CTLA4	3	0	
	GITR	4	0	
	HSA	2	0	
	MBP-intimin	4	2	2
		16 (100%)	5 (31%)	5 (31%)
VHB82 <sub>SS</sub>	CEACAM6	5	5	5
	CTLA4	9	0	
	GITR	5	1	1
	HSA	6	3	1
	MBP-intimin	3	2	1
		28 (100%)	11 (39%)	8 (29%)
Total		59 (100%)	23 (39%)	20 (34%)

<sup>a</sup>Double entries reflect two independent isolation attempts.

impacts the selection of antigen-specific binders from synthetic V<sub>H</sub>/V<sub>L</sub> sdAb libraries. In an effort to mitigate these factors, we attempted to identify ultra-stable V<sub>H</sub>/V<sub>L</sub> sdAb scaffolds upon which we could construct highly diverse, stability-enhanced phage-displayed V<sub>H</sub>/V<sub>L</sub> sdAb libraries designed to yield soluble and thermostable antigen-specific human sdAbs.

### Biophysical Stability Assessment of Wild-Type Human V<sub>H</sub>/V<sub>L</sub> sdAb Scaffolds

The *T<sub>m</sub>*s and aggregation tendencies of 22 potential V<sub>H</sub> sdAb scaffolds and 18 potential V<sub>L</sub> sdAb scaffolds were determined by circular dichroism and SEC (Tables S2 and S3 in Supplementary Material). Five V<sub>H</sub> and five V<sub>L</sub> sdAb scaffolds as well as their disulfide-stabilized equivalents (Table 1) were selected as the most promising candidates for library construction based on: (i) primarily monomeric folding, (ii) high thermostability with reversible thermal unfolding, and (iii) reasonable expression yields (>1 mg/L) from overnight *E. coli* TG1 cultures. As reported previously (39, 40), incorporation of a disulfide linkage spanning IMGT positions 54–78 increased the *T<sub>m</sub>* of

each scaffold by ~5–20°C but also had unpredictable effects on expression yields.

### Tolerance of Human V<sub>H</sub>/V<sub>L</sub> sdAb Scaffolds to CDR Modification

As a preliminary investigation into which of the 20 V<sub>H</sub>/V<sub>L</sub> sdAb scaffolds might best tolerate library randomization, we grafted 12 sets of exogenous CDRs (Table 2) into each scaffold and assessed the resulting molecules' expression level (Bradford assay), aggregation tendency (SEC-MALS), *T<sub>m</sub>* (thermal shift assay), and ability to refold after thermal denaturation (turbidity assay). For V<sub>L</sub> sdAb scaffolds, the 12 sets of exogenous CDRs were derived from non-antigen-specific human V<sub>L</sub> sdAbs isolated from previously constructed libraries with expression yields ≥10 mg/L and for V<sub>H</sub> sdAb scaffolds, the 12 sets of exogenous CDRs were selected from either human V<sub>H</sub> sdAbs of unknown antigen specificity isolated from previously constructed libraries or camelid V<sub>H</sub>H sdAbs with expression yields ≥3 mg/L.

The V<sub>L</sub> sdAb scaffolds yielding the best-expressing CDR-shuffled variants were VL383<sub>SS</sub>, VL325<sub>SS</sub> and VL335<sub>SS</sub> (Figure 1A). CDR-shuffled variants of VL383<sub>SS</sub> and VL325<sub>SS</sub> were primarily monomeric by SEC-MALS, while CDR-shuffled variants of VL335<sub>SS</sub> showed some tendency to aggregate (Figure 1C). All three of these V<sub>L</sub> sdAb scaffolds, especially VL325<sub>SS</sub>, yielded CDR-shuffled variants with high *T<sub>m</sub>*s (Figure 1E); however, many CDR-shuffled variants of VL325<sub>SS</sub> showed significant turbidity upon heat denaturation (Figure 1G), reflecting their inability to refold as soluble monomers. The V<sub>H</sub> sdAb scaffolds yielding the best-expressing CDR-shuffled variants were VH420, VH428, VHB82, VHB82<sub>SS</sub>, and VHM81<sub>SS</sub> (Figure 1B). CDR-shuffled variants of all five of these V<sub>H</sub> sdAb scaffolds were similarly monomeric (Figure 1D) but as expected, the two disulfide-stabilized sdAb scaffolds (VHB82<sub>SS</sub> and VHM81<sub>SS</sub>) yielded CDR-shuffled variants with higher *T<sub>m</sub>*s (Figure 1F). Similar proportions of the CDR-shuffled variants of all five V<sub>H</sub> sdAb scaffolds showed minor turbidity upon heat denaturation (Figure 1H). On the basis of these data, we selected one V<sub>L</sub> sdAb scaffold (VL383<sub>SS</sub>) and two V<sub>H</sub> sdAb scaffolds (VH428 and VHB82<sub>SS</sub>) for library construction, reflecting a balance of their tolerance to CDR modification as well as their differing CDR3 lengths and germline gene rearrangements.

### Design and Construction of Phage-Displayed Human V<sub>H</sub>/V<sub>L</sub> sdAb Libraries

Three synthetic sdAb libraries (VL383<sub>SS</sub>, VH428, and VHB82<sub>SS</sub>) were constructed by limited *in vitro* randomization of the CDRs of these V<sub>H</sub>/V<sub>L</sub> sdAb scaffolds and cloning of the resulting DNA

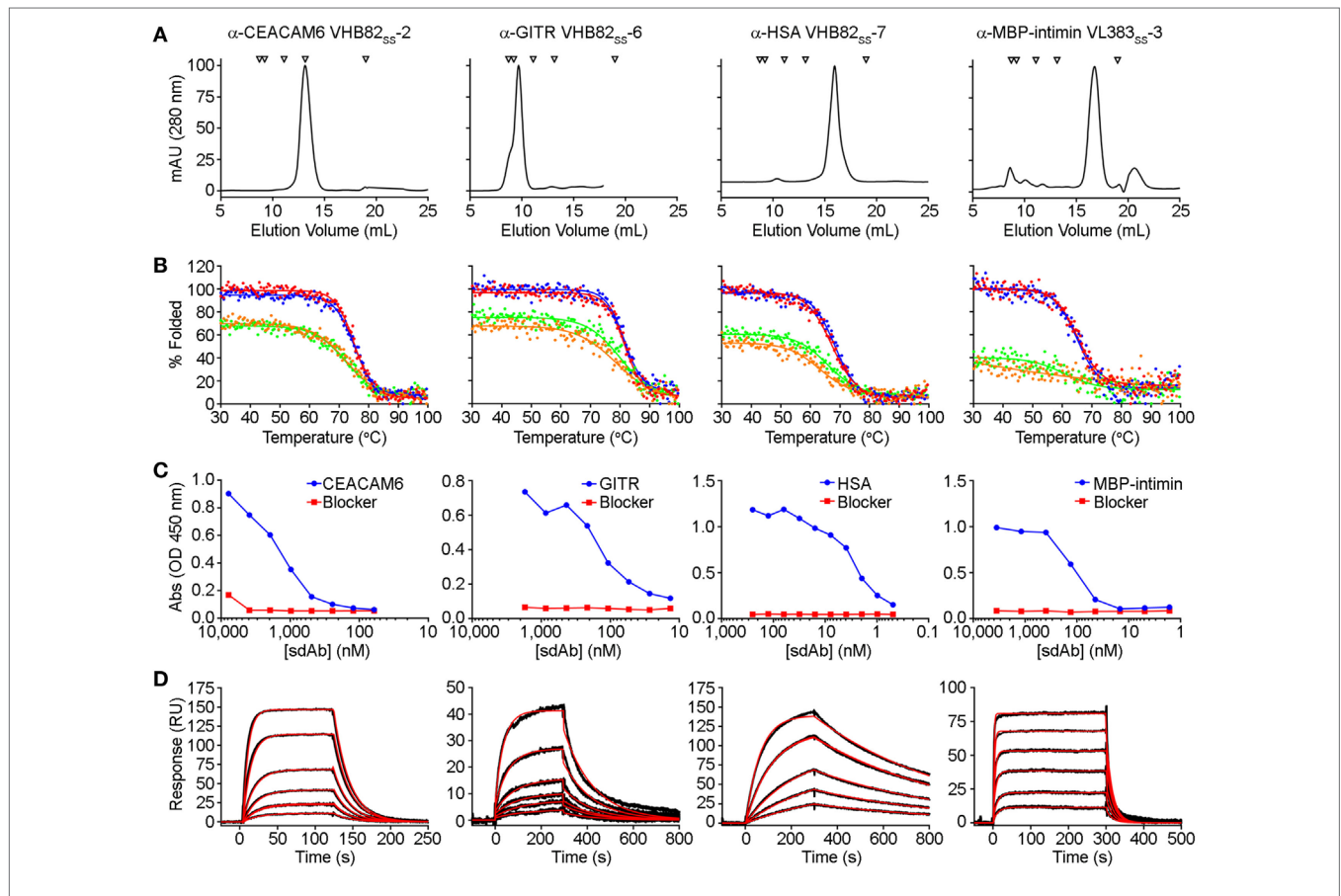


into the pMED1 phagemid vector (**Figures 2A,B**). CDR3 length was varied in each library (**Figures 2A,D**; VL383<sub>SS</sub> library: 8, 9, or 10 residues; VH428 and VHB82<sub>SS</sub> libraries: 10, 12, 14, 16, 18, 20, or 22 residues) while CDR1 and CDR2 lengths were constant. The major technical advances of these over our previously described phage-displayed synthetic human  $V_H/V_L$  sdAb libraries (12, 21, 31) were (i) trinucleotide mutagenesis allowed for incorporation of defined mixtures of amino acids at each randomization position, based on alignments of human and llama antibodies with additional bias toward solubility-promoting residues (Asp, Glu) and against undesirable residues (Asn, Cys, and Met) and stop codons (**Figures 2B,C**; Figure S2 in Supplementary Material) and (ii) near-complete randomization of all three CDRs of each  $V_H/V_L$  sdAb scaffold resulted in much higher sequence diversity for the vast majority of library molecules (**Figure 2E**). All three  $V_H/V_L$  sdAb libraries were

transformed into *E. coli* TG1 cells, yielding final library sizes ( $1.0\text{--}2.3 \times 10^{10}$  independent transformants) that, as expected, vastly under-sampled theoretical library diversity (VL383<sub>SS</sub>:  $2.9 \times 10^{13}$  unique sequences; VHB82<sub>SS</sub>:  $2.3 \times 10^{33}$  unique sequences; VH428:  $2.3 \times 10^{35}$  unique sequences). At this stage, prior to helper phage rescue, no major clonality biases or deviations from library design were observed (data not shown).

## Isolation and Characterization of Antigen-Specific Human $V_H/V_L$ sdAbs

All three  $V_H/V_L$  sdAb libraries were rescued with M13K07 helper phage and panned for four or five rounds against five model antigens (CEACAM6, CTLA4, GITR, HSA, and MBP-intimin). All library pannings were performed in duplicate by two independent operators at the same time and using the same materials, except for panning against MBP-intimin, in which



**FIGURE 3** | Properties of selected antigen-specific single-domain antibodies (sdAbs) isolated from the VL383<sub>SS</sub>, VH428, and VHB82<sub>SS</sub> synthetic human  $V_H/V_L$  sdAb libraries. The single highest affinity sdAb against each target is shown, except for MBP-intimin, where VL<sub>SS</sub>-3 is shown instead of VL<sub>SS</sub>-4 or VL<sub>SS</sub>-5 because of better fit to a 1:1 binding model. **(A)** Size exclusion chromatography (SEC) profiles of representative antigen-specific human  $V_H/V_L$  sdAbs. Arrows show molecular mass standards, from left to right: thyroglobulin (670 kDa), gamma globulin (158 kDa), ovalbumin (44 kDa), myoglobin (17 kDa), and vitamin B12 (1.35 kDa). **(B)** Thermal unfolding of representative antigen-specific  $V_H/V_L$  sdAbs as determined by circular dichroism. Replicate unfolding curves are shown in red and blue; the sdAbs were then cooled to room temperature and remelted (shown in orange and green). **(C)** Titration ELISA of representative antigen-specific  $V_H/V_L$  sdAbs. Horseradish peroxidase mouse anti-c-Myc secondary antibody (clone 9E10, diluted 1:3,000) was used for detection. **(D)** Binding of antigen-specific  $V_H/V_L$  sdAbs to cognate antigen by SPR. Each antigen was immobilized on a CM5 sensor chip using amine coupling, then the indicated  $V_H$  or  $V_L$  sdAb was flowed over the surface at concentrations ranging from 25 to 1,000 nM ( $\alpha$ -CEACAM6 VHB82<sub>SS</sub>-2), 25 to 500 nM ( $\alpha$ -GITR VHB82<sub>SS</sub>-6), 2.5 to 50 nM ( $\alpha$ -HSA VHB82<sub>SS</sub>-7), or 62.5 to 2,500 nM ( $\alpha$ -MBP-intimin VL383<sub>SS</sub>-3). Black lines show data and red lines show fits.

**TABLE 4** | Properties of antigen-specific single-domain antibodies (sdAbs) isolated from the phage-displayed synthetic human  $V_H/V_L$  libraries.

Target	$V_H/V_L$ sdAb	Expression yield (mg/L)	Monomer (%)	$T_m$ (°C)	$K_D$ (nM)
CEACAM6	VL383 <sub>SS</sub> -1	18.4	>95	76.9	454 <sup>a</sup>
	VH428-1	3.4	>95	57.6	2,180 <sup>b</sup>
	VH428-2	3.6	>95	61.5	1,230 <sup>b</sup>
	VH428-3	1.9	>95	52.9	290 <sup>b</sup>
	VHB82 <sub>SS</sub> -1	6.4	>95	81.4	638 <sup>b</sup>
	VHB82 <sub>SS</sub> -2	18.8	>95	75.1	245 <sup>b</sup>
	VHB82 <sub>SS</sub> -3	5.4	>95	72.5	2,730 <sup>b</sup>
	VHB82 <sub>SS</sub> -4	3.2	80.0	68.3	1,070 <sup>a</sup>
	VHB82 <sub>SS</sub> -5	2.4	>95	71.9	2,200 <sup>b</sup>
GITR	VHB82 <sub>SS</sub> -6	7.2	0 <sup>c</sup>	81.4	196 <sup>b</sup>
HSA	VHB82 <sub>SS</sub> -7	8.0	>95	67.7	5 <sup>b</sup>
MBP-intimin	VL383 <sub>SS</sub> -2	2.0	>95	69.6	905 <sup>b,c</sup>
	VL383 <sub>SS</sub> -3	0.2	83.4	65.1	395 <sup>b</sup>
	VL383 <sub>SS</sub> -4	1.2	88.7	65.3	227 <sup>b</sup>
	VL383 <sub>SS</sub> -5	3.7	94.6	74.2	252 <sup>b,c</sup>
	VL383 <sub>SS</sub> -6	9.9	>95	76.6	7,470 <sup>b</sup>
	VL383 <sub>SS</sub> -7	8.0	>95	76.7	11,500 <sup>b,d</sup>
	VH428-4	0.1	>95	58.9	2,590 <sup>b</sup>
	VH428-5	0.1	>95	n.d.	4,430 <sup>b</sup>
	VHB82 <sub>SS</sub> -8	8.0	72.5	69.3	5,230 <sup>a</sup>

<sup>a</sup>Determined using steady-state analysis at 25°C.

<sup>b</sup>Determined using multicycle kinetic analysis and fitting to a 1:1 binding model at 25°C.

<sup>c</sup>Antigen was immobilized on a C1 sensor chip, evidence of complex binding.

<sup>d</sup> $K_D$  is an estimate only due to lack of curvature in the steady-state plot.

<sup>e</sup>Size exclusion chromatography elution volume suggests VHB82<sub>SS</sub>-6 is a strict dimer. n.d., not determined.

panning was done in triplicate. High attrition rates of  $V_H/V_L$  sdAbs showing false positive binding either as sdAb-phage or as soluble sdAb proteins (VL383<sub>SS</sub>: 53% attrition; VH428: 69% attrition; VHB82<sub>SS</sub>: 71% attrition; **Table 3**) resulted in a final yield of 20 unique antigen-specific  $V_H/V_L$  sdAbs against four targets. Of the 15 library-target screens we conducted, eight (53%) yielded at least one antigen-specific  $V_H/V_L$  sdAb (four screens yielded one sdAb, two screens yielded two sdAbs, one screen yielded three sdAbs, and two screens yielded five sdAbs). Most of the recovered sdAbs were monomeric (**Figure 3A**; **Table 4**; **Figure S3** in Supplementary Material), thermostable (**Figure 3B**; **Table 4**), and had affinities for antigen ranging from 5 nM to ~12  $\mu$ M (**Figures 3C,D**; **Table 4**). One notable exception was the  $\alpha$ -GITR  $V_H$  sdAb VHB82<sub>SS</sub>-6, whose elution volume by SEC suggested it existed in solution as a strict dimer (**Figure 3A**). Stable homodimerization has previously been reported for several human  $V_H$  sdAbs and was critical for antigen binding (49–52); this phenomenon is distinct from the general tendency of some  $V_H$  domains to form soluble aggregates. Antigen-specific  $V_H/V_L$  sdAbs isolated from all three libraries had aggregation tendencies and thermostabilities reflective of the parental  $V_H/V_L$  sdAb scaffold from which they were derived, but generally poorer expression yields (**Figure 4A**). Reproducibility in the selection of specific sdAb sequences from the libraries was modest, with only 45% (9/20) of antigen-specific  $V_H/V_L$  sdAbs recovered by both operators (**Figure 4B**) and no apparent connection between antigen-binding affinity and consistency of isolation.

## Evaluation of Stability-Sequence Diversity Tradeoffs in Human $V_H/V_L$ sdAb Libraries

To better understand potential constraints on the CDR sequences of monomeric and stable human  $V_H/V_L$  sdAbs, we examined the effects of stability selection (three rounds of protein A or L selection followed by amplification of the eluted phage overnight in *E. coli* TG1 cells; **Figure 5**) on randomized sequence diversity of two  $V_H/V_L$  sdAb libraries (VL383<sub>SS</sub> and VHB82<sub>SS</sub>). We performed this experiment in duplicate using either phage particles displaying monovalent sdAb (rescued with M13K07 helper phage; simultaneous expression of pIII from helper phage and pIII-sdAb from phagemid) or phage particles displaying multivalent sdAb (rescued with M13K07 $\Delta$ pIII hyper phage; only pIII-sdAb expressed from phagemid). Out-of-frame and/or stop-codon-encoding  $V_H/V_L$  sdAb clones were rare in both libraries (“Library Cells”), but rose substantially in frequency upon phage rescue (“Library Phage”) and upon amplification in *E. coli* (“Amplification in *E. coli*”), suggesting a growth advantage for non-sdAb expressing cells over sdAb-expressing ones (**Figures 5A,B**); this phenomenon was mitigated somewhat using hyper phage rescue. After three rounds of protein A/L selection and overnight amplification in *E. coli* with helper phage rescue, there were clear clonal biases observed in the resulting populations of sdAb-phage (**Figures 5C,D**). Using an arbitrary frequency cutoff (0.00006% for VL383<sub>SS</sub> and 0.00004% for VHB82<sub>SS</sub>; sdAbs at frequencies greater than these cutoffs were not present in any other dataset) to identify unique sdAb sequences enriched by stability selection, we found that different sdAb clones were selected in the two replicate pannings, although both sets of sdAbs were heavily biased toward the parental  $V_H/V_L$  sdAb scaffold’s CDR3 length (9 residues for the VL383<sub>SS</sub> library and 10 residues for the VHB82<sub>SS</sub> library, which is the shortest CDR3 length possible in the library design and the nearest to the VHB82<sub>SS</sub> scaffold’s CDR3 length of 6 residues; **Figure S4** in Supplementary Material). However, stability selection reproducibly yielded  $V_H/V_L$  sdAbs with biased CDR amino acid composition (**Figures 5E,F**; **Figures S5** and **S6** in Supplementary Material). In order of magnitude, stability biases in the VL383<sub>SS</sub> library favored Asp, His, Pro, Ser and Thr and disfavored aromatic (Phe, Trp, Tyr) and hydrophobic (Ile, Leu, Val) residues. Similarly, stability biases in the VHB82<sub>SS</sub> library favored Asp, His, Pro, and Gln and disfavored aromatic (Phe, Trp, Tyr) and hydrophobic (Ile, Leu, Val) residues. These biases were especially acute at the C-terminus of CDR1 and N-terminus of CDR2, both of which flank FR2. Identical molecular signatures were observed to a lesser degree in the pools of all sdAb-phage (irrespective of frequency or mono- vs. multivalent display format) subjected to three rounds of stability selection (**Figures S7** and **S8** in Supplementary Material) as well as in the pools of sdAb-phage after phage rescue and eluted from protein A/L (data not shown), suggesting a common ontogeny.

## DISCUSSION

The starting point for this investigation was the observation that several of our previously described synthetic human  $V_H/V_L$  sdAb libraries performed unpredictably (12, 21, 31), yielding monomeric antigen-specific binders against some targets but





**FIGURE 5** | Continued

Impact of stability selection on human  $V_H/V_L$  single-domain antibody (sdAb) library sequence diversity. After transformation of *Escherichia coli* TG1 cells with phagemid DNA, phage were rescued by superinfection of overnight cultures with M13K07 helper phage or M13K07 $\Delta$ pIII hyper phage. The purified sdAb-displaying phage were bound and eluted from protein A (VHB2<sub>SS</sub> library) or protein L (VL383<sub>SS</sub> library), then amplified by reinfection of *E. coli* TG1 cells. Three rounds of panning were performed, and  $V_H/V_L$  sdAb sequences were interrogated by NGS at the stage of rescued phage, phage eluted after a single round of protein A/L selection, and phage amplified after the final round of panning. **(A,B)** Proportion of functional sdAb sequences (in-frame ORF, no stop codons) observed in  $V_L$  **(A)** and  $V_H$  **(B)** library phage and panning outputs. **(C,D)** Clonality of  $V_L$  **(C)** and  $V_H$  **(D)** library phage and panning outputs. **(E,F)** Complementarity-determining region (CDR) amino acid composition of enriched  $V_L$  **(E)** and  $V_H$  **(F)** sdAb clones after three rounds of stability selection. Crossed-out cells indicate a frequency of <0.1%. Analyses in **(A–F)** are representative of  $7.7 \times 10^4$  to  $7.9 \times 10^6$  sequences per sample.

of undersampling include increasing throughput (53), use of  $V_H/V_L$  sdAb-transgenic mice (54, 55) and use of *in vitro* VDJ recombination systems (56). Nonetheless, modest inter-operator reproducibility in isolating the same binders clearly demonstrates that antigen-specific human  $V_H/V_L$  sdAbs are not always isolated even when they were present in the library. We currently have no understanding of the factors influencing the number of  $V_H/V_L$  sdAb binders isolated, their affinities or biophysical properties, nor if these depend on the library, the target antigen quality or composition, or the panning methodology. One possibility, for example, is that the numbers of input library sdAb-phage used here, the target antigen surface size and density, and/or the numbers of eluted phage amplified from each round of selection were inadequate to consistently recover very rare sdAb specificities that may be present in the libraries. These factors could be investigated empirically in future studies.

It is virtually certain that some of the challenges of human synthetic  $V_H/V_L$  sdAbs relate to fundamental tradeoffs between stability and sequence diversity. There is no necessary reason why rare autonomous rearranged human  $V_H/V_L$  sdAbs should be compatible with any CDR sequence; rather, it should be expected that these molecules rely chiefly on particular CDR sequences for their solubility and stability, given that human  $V_H$  and  $V_L$  domains have evolved to be paired with one another, occluding a hydrophobic surface between the two domains. We expect that such challenges are much less of a problem for protein domains that naturally exist as soluble monomers such as camelid and shark sdAbs and non-antibody scaffolds (e.g., FN3 and SH3 domains). Some camelid  $V_H$ s rely on CDR residues for solubility as well (57), albeit likely to a lesser extent due to the presence of solubility-enhancing FR2 residues. One obvious explanation for the previously described bias toward negatively charged residues resulting in acidic overall pIs of  $V_H/V_L$  sdAbs (4, 12), especially in CDR1 and CDR2 (10, 11), is that this may enhance solubility and aggregation resistance. The role of charge and negative charge in particular in solubilizing  $V_H/V_L$  sdAbs with hydrophobic CDRs has been previously demonstrated (58, 59), and appears to be highly position and scaffold dependent (4). Bias in favor of His residues is less easy to explain, although its imidazole side chain may also have stabilizing and solubilizing effects near physiological pH (60). Notably, “camelized” human  $V_H$  sdAbs and human  $V_H/V_L$  sdAbs selected *in vitro* to bear solubility-promoting FR substitutions (9, 61), may not be subject to the same stability-sequence diversity tradeoffs. We caution that although the growth advantages conferred by  $V_H/V_L$  sdAbs with the most stable and soluble CDR sequences were most apparent using helper phage rescue of phagemid

libraries, forcing pIII-sdAb expression using hyper phage rescue or by using phage (not phagemid) or yeast display systems would not be expected to circumvent the issue of bias; instead, it might be expected to result in immediate loss of a large population of  $V_H/V_L$  sdAbs with poorly stable and soluble CDR sequences.

In conclusion, we have described three novel synthetic human  $V_H/V_L$  sdAb libraries as well as antigen-specific binders against a variety of target antigens selected from these libraries. Future work will seek to better understand the constraints imposed on human  $V_H/V_L$  sdAbs by stability-sequence diversity tradeoffs, and whether it is possible to circumvent them by *in vitro* engineering of human autonomous immunoglobulin variable domain folds. One possibility would be to identify and fix a minimal set of stability-enhancing CDR residues in human  $V_H/V_L$  sdAb libraries, which might allow for more effective randomization of the remaining CDR positions. However, doing so without significant divergence from human germline IGHV sequences, increasing the risk of immunogenicity, may be very challenging.

## AUTHOR CONTRIBUTIONS

DK, HK, and JT isolated and characterized human  $V_H/V_L$  sdAb scaffolds and conducted CDR-shuffling experiments and designed the libraries. JS conducted SEC-MALS experiments. ML, HK, and KH isolated and characterized antigen-specific sdAbs. ML and KH conceived and carried out stability selections and next-generation DNA sequencing analyses. QY, GH, and CRM designed, carried out, and analyzed surface plasmon resonance experiments. KH and GH made the figures and KH wrote the manuscript. All authors read and approved the final manuscript.

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## SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at <http://www.frontiersin.org/articles/10.3389/fimmu.2017.01759/full#supplementary-material>.

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**Conflict of Interest Statement:** JT and DK are inventors of US patents 8293233B2 and 9371371B2 as well as other patents and patent applications governing human V<sub>H</sub>/V<sub>L</sub> sdAb scaffolds.

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