Catching COVID: Engineering Peptide-Modified Surface-Enhanced Raman Spectroscopy Sensors for SARS-CoV-2

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ABSTRACT: COVID-19 remains an ongoing issue across the globe, highlighting the need for a rapid, selective, and accurate sensor for SARS-CoV-2 and its emerging variants. The chemical specificity and signal amplification of surface-enhanced Raman spectroscopy (SERS) could be advantageous for developing a quantitative assay for SARS-CoV-2 with improved speed and accuracy over current testing methods. Here, we have tackled the challenges associated with SERS detection of viruses. As viruses are large, multicomponent species, they can yield different SERS signals, but also other abundant biomolecules present in the sample can generate undesired signals. To improve selectivity in complex biological environments, we have employed peptides as capture probes for viral proteins and developed an angiotensin-converting enzyme 2 (ACE2) mimetic peptide-based SERS sensor for SARS-CoV-2. The unique vibrational signature of the spike protein bound to the peptide-modified surface is identified and used to construct a multivariate calibration model for quantification. The sensor demonstrates a 300 nM limit of detection and high selectivity in the presence of excess bovine serum albumin. This work provides the basis for designing a SERS-based assay for the detection of SARS-CoV-2 as well as engineering SERS biosensors for other viruses in the future.

KEYWORDS: SERS, biosensor, COVID-19, SARS-CoV-2, peptide, virus, biomimetic
with a great deal of signal resulting from the antibody itself and also suffering from the same complications as existing immunosensing strategies.7 Instead, smaller motifs such as DNA aptamers or peptides can be utilized as capture probes to target viruses.14−17 These small capture agents are advantageous due to their facile synthesis and better stability compared to antibodies. Given the near-field enhancement of SERS signals, small capture molecules attached to the nanostructures can concentrate the analyte at the surface where the electric field enhancement is the greatest and thus improve limits of detection. Additionally, the SERS signal depends on the orientation of the analyte on the substrate. Capture molecules can uniformly orient the analyte on the surface, improving signal reproducibility, increasing selectivity, and enabling quantitative models.13 Recently, this approach has successfully detected the influenza virus and HIV-1 DNA by SERS.12,13

Generating a reproducible response from a specific analyte enables machine learning algorithms to analyze the observed signal.15−18 As opposed to performing univariate analysis on a peak characteristic of the analyte, limits of detection and selectivity can be improved by utilizing multivariate analysis techniques, such as multivariate curve resolution (MCR), to create a calibration model based on the entire spectral signature.19 Using a simple capture agent reproducibly orient the desired analyte on the surface,20 giving rise to a conserved SERS signal that can be extracted from complex mixtures. With appropriate preprocessing, such as normalizing the SERS intensity to an internal standard, quantitative calibration models can be obtained.20−22 Building models based on a target spectrum can significantly enhance selectivity in the presence of similar, potentially interfering molecules.23

Here, we present a peptide-based SERS sensor for SARS-CoV-2 that may provide faster, more accurate detection and aid in stopping the spread of COVID-19. SARS-CoV-2 binds to the ACE2 receptor through its spike surface proteins.25 The receptor binding domain of the spike protein and its presence of similar, potentially interfering molecules.23,24 has successfully detected the in 2019-nCoV,23 which can be utilized as capture probes to bind the SARS-CoV-2 spike RBD-His.28 to selectively capture the SARS-derived from the domain of ACE2 that binds the receptor

Peptide Synthesis and Purification. All peptides were synthesized using a standard fluoro-9-ylmethoxycarbonyl (Fmoc) solid-phase peptide synthesis method (Liberty Blue, CEM) on rink amide MBHA resin (100−200 mesh, 0.77 mmol/g). Peptides were cleaved from the resin using a solution of 95% trifluoroacetic acid (TFA), 2.5% triisopropylsilane (TIPS), and 2.5% dH2O. The acid was evaporated, and the crude peptide was purified using reverse-phase HPLC (Shimadzu UFLC, Ultra C18 5 μm, 100 × 10 mm column) with a gradient of 0.1% TFA in water (solvent A) and acetonitrile (solvent B) over 50 min. Purified peptides were lyophilized and stored at −20 °C. Purity was confirmed by electrospray ionization mass spectrometry and HPLC.

X-ray Photoelectron Spectroscopy (XPS). Gold-coated Silmeco SERS substrates were pre-cleaned by heating to 175 °C for 10 min under a stream of nitrogen gas. A 1 mM solution of 4-cyano-4′-toluidinofluorescein was reduced for 1 h. The substrates were submerged in the reduced peptide solution overnight to functionalize the gold surface. Substrates were then washed with 1 mL of sterile water and backfilled by exposure to 100 μM 2-mercaptoethanol for 1 h. Substrates were rinsed in sterile water and dried before use. To assess protein binding, modified substrates were incubated for 1 h with 1 μM RBD in PBS followed by three washes in water.

XP spectra were recorded using a Kratos Axis Ultra DLD X-ray photoelectron spectrometer with a monochromatic Al Kα source at 150 W. The spot size area was 300 μm × 700 μm. Survey scans over a binding energy range of 0−1200 eV were taken for each sample with a constant detector pass energy range of 80 eV followed by a high-resolution XPS measurement (20 eV pass energy) for quantitative determination of binding energy and atomic concentration. Background subtraction, peak integration, and fitting were carried out using Kratos software. To convert peak areas to surface concentration, default instrument sensitivity factors were used (N = 0.477, C = 0.278, O = 0.780, S = 0.668, Si = 0.328, and Au = 0.250).

The RBD was modified with peptide and RBD as described above and were then fixed with 2% paraformaldehyde and 2.5% glutaraldehyde in PBS for 20 min. The fixed substrates were blocked with 2% BSA for 30 min, washed with PBS, and incubated with primary CR3022 antibody (recombinant anti-SARS-CoV-2 spike chimeric rabbit monoclonal antibody, 10 μg/mL) at room temperature for 1 h. The substrates were washed with PBS and incubated for another hour with goat anti-rabbit IgG-Alexa488 (4 μg/mL). The immunolabeled substrates were washed with sterile water before being mounted on a glass coverslip for imaging. Images were taken on a Zeiss 710 laser scanning confocal microscope.

Scanning Electron Microscopy (SEM). For SEM, substrates were cleaned or modified with peptide as described above and were then dried under a stream of nitrogen gas. For immunolabeled SEM surfaces, substrates modified with SERS-coated peptide-modified substrates, were incubated with primary CR3022 antibody (recombinant anti-SARS-CoV-2 spike chimeric rabbit monoclonal antibody, 10 μg/mL) at room temperature for 1 h. The substrates were washed with PBS and incubated for another hour with goat anti-rabbit IgG-Alexa488 (4 μg/mL). The immunolabeled substrates were washed with sterile water before being mounted on a glass coverslip for imaging. Images were collected using an FEI Helios 600 Nanolab Dual Beam System operating at a 5.00 kV accelerating voltage.

Biolaer Interferometry (BLI). Dissociation constants (Kd) of peptides were measured by biolayer interferometry (BLI; ForteBio Octet Red 384). Streptavidin BLI tips were functionalized with 2.5 μM biotin-SBP and biotin-SBP-PEG, in 1× kinetic buffer (1× PBS with 0.1% BSA and 0.05% Tween 20). Peptide-modified tips were incubated with various concentrations of SARS-CoV-2 RBD from 0 to 5 μM for 400 s. Then, dissociation was measured for 600 s.

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Figure 1. Characterization of peptide-modified sensor for detection of SARS-CoV-2. (A) Schematic of peptide-modified SERS substrates (i) before and (ii) after binding the spike protein of SARS-CoV-2. (B) Sequence and chemical structure of ACE2-derived peptide used to modify surfaces and bind the spike protein. (C) Normalized XPS spectra of SERS substrates showing peptide modification and RBD binding. (D) Atomic composition of surfaces used in (c) showing successful modification and RBD binding. (E) (i) CLSM 3D reconstructed side-view images of immunolabeled SERS surfaces modified with SBP-PEG$_2$ before and after RBD binding (scale bar = 2 μm). (ii) Relative fluorescence from quantification of integrated density before and after RBD binding ($n = 4$, area per $n = 156$ μm$^2$).

Corresponding binding affinities of peptides were analyzed with steady-state analysis using the HT analysis software. The $K_d$ for SBP and SBP-PEG$_2$ were 4.4 ± 0.5 and 2.9 ± 1.4 μM, respectively. Specificity measurements were carried out using the method described above with the SBP-PEG$_2$ peptide. Each RBD (SARS-CoV-2, SARS-CoV-1, and MERS) was tested at 2 μM.

Circular Dichroism (CD). CD spectra were obtained on a Chirascan Plus Spectropolarimeter using a 1 mm path length cuvette. Cysteine-modified peptides were solubilized in PBS at 100 μM. Spectra were recorded from 200 to 300 nm.

Surface-Enhanced Raman Spectroscopy (SERS). SERS spectra were obtained using a Renishaw inVia Qontor confocal Raman microscope equipped with a CCD camera. A continuous wave laser at 785 nm, a 1200 grooves/mm grating, a 50× objective with NA = 0.50, and all solutions were kept frozen or on ice once thawed prior to use. Solutions of 0.1% BSA were prepared in 1× PBS. Spike/BSA mixtures were prepared by combining 0.1% BSA in 1× PBS with stock spike protein in equal parts. For all SERS experiments, 10 μL of protein solution was dropped onto the surface. For experiments on unmodified gold substrates, protein solution was added to the surfaces, and spectra were collected immediately. A power of 2 mW was used to acquire 20 μm × 20 μm spectral maps with a 1 μm step size in the xy-plane. Considering the significant heating of the local environment during SERS measurements, photothermal damage to the surface and the sample can be avoided by utilizing near-infrared wavelengths and low powers along with imaging the surface while wet.\cite{30,31} Laser powers were optimized to avoid potential photodamage to the surfaces.\cite{31} All SERS measurements were taken on wet substrates. For peptide-functionalized substrates, protein solution was added and allowed to bind for 30 min before rinsing with water to remove any unbound protein, and SERS measurements were obtained at a power of 570 μW with a 10 μm × 10 μm map size.

SERS Data Processing and Analysis. Cosmic rays were removed from SERS maps in Windows-based Raman Environment (WIRE) software (version 5.2.10411) from Renishaw. Spectral analysis was performed in MATLAB (R2019b, The Mathworks Inc.). MCR was performed using the PLS Toolbox version 8.7.1 (Eigenvector Research Inc.).

**RESULTS AND DISCUSSION**

**Surface Modification and Characterization.** To design a SERS sensor to detect SARS-CoV-2, we modified SERS
substrates with a peptide motif derived from the cell surface receptor, ACE2, which binds the RBD of the SARS-CoV-2 spike protein.25,28 Displaying the spike-binding peptide (SBP) on SERS substrates will enable the selective capture of SARS-CoV-2 from complex media and its detection using SERS (Figure 1A). By synthesizing the SBP with a cysteine residue at its N-terminus (Figure S1), a strong gold-thiol bond attaches this sequence to the gold SERS substrates.

It is ideal to achieve monolayer coverage of the capture molecule in a consistent orientation on the surface. With cysteine-terminated probes, reduction of disulfide bonds before surface modification ensures that the sulfur groups are free to bind to the substrate. Additionally, backfilling with a short-chain thiol can fill the empty spots between probe molecules, encouraging the probe to orient uniformly and in an upright position.32 This process can also displace any nonspecifically adsorbed molecules, including contaminants that might remain after cleaning.

Binding of biomolecules to a surface is highly influenced by the chemical properties of the surface,33 suggesting that the distance between the surface and the capture peptide recognition sequence could affect its binding affinity to the target molecule. We therefore also examined a second peptide, SBP-PEG₄ (Figure S2), with a PEG₄ spacer between the N-terminal cysteine residue and the spike-binding motif (Figure 1B). XPS measurements show successful modification of the substrates with the peptides and RBD binding to the SBP-PEG₄ surface. From the XPS spectra (Figure 1C) of unmodified versus modified substrates, peaks appear at 288, 399, and 531 eV, indicating amide bonds, primary amines, and C=O bonds, respectively. Interestingly, the more predominant amide peak and increased nitrogen-to-gold ratio for the SBP-PEG₄-modified substrate compared to the SBP-modified substrate indicate that the linker may facilitate better attachment to the surface (N:Au ratios are 0.85 and 0.99 for SBP and SBP-PEG₄ respectively). Upon RBD binding to the SBP-PEG₄ substrate, the XPS spectra maintain a strong amide peak while the N:Au ratio increases from 0.99 to 1.45, indicating that protein is binding to the SBP-PEG₄-modified substrate. RBD binding to the SBP-modified substrate was also measured using XPS (Figure S3) with the N:Au ratio increasing from 0.85 to 1.31. Overall, quantification of the atomic composition from the XPS (Figure 1D) supports successful modification and RBD binding as indicated by the increasing N:Au ratio after both steps.

To further confirm RBD binding, SBP-PEG₄-modified substrates with and without RBD were immunolabeled with anti-RBD fluorescent antibodies and imaged using CLSM to create a 3D reconstruction of the surface (Figure S4). Side-view images of the substrates (Figure 1E(i)) show minimal background signals for SBP-PEG₄ substrates, but after incubation with RBD, increased emission is observed, indicating successful RBD binding. Quantification of the relative fluorescence shows a significant increase after RBD binding (Figure 1E(ii)). SEM images of the substrates (Figure S5) show clustering of pillars after peptide modification, consistent with the known behavior of the SERS substrate.34 RBD binding is visualized by immunolabeling with gold-nanoparticle-conjugated antibodies (Figure S6).

Enhancing Binding Affinity of the Capture Peptide. We reasoned that introducing a spacer to the peptide between the surface-binding functional group and the analyte binding domain will enable better folding of the peptide–RBD complex and will therefore improve its binding affinity for the RBD. Indeed, BLI measurements of biotinylated versions of SBP (Figure S7) and SBP-PEG₄ (Figure S8) attached to streptavidin-coated BLI tips show a higher response to an increasing spike–RBD concentration from SBP-PEG₄ compared to the SBP sequence (Figure S9). Steady-state analysis of the BLI response indicates that the PEG₄ spacer enhances the Kᵣ of the peptide from 4.4 to 2.9 μM (Figure 2A), indicating the importance of a spacer between the surface and the spike-binding motif to allow for effective binding of the viral spike protein.

Figure 2. Linker affects binding affinity of ACE2-derived peptides for RBD. (A) Steady-state analysis of BLI data to determine Kᵣ values. (B) CD spectra of cysteine-modified peptides with and without a linker comparing the ability of each to form α-helical structures. (C) BLI response of SBP-PEG₄ showing specific binding to RBD from SARS-CoV-2 compared to SARS-CoV-1 and MERS.

As the native spike-binding motif adopts an α-helix conformation when in the ACE2 protein, we speculate that the spacer might affect the secondary structure of the peptide.25,35 CD measurements show that both SBP and SBP-PEG₄ have a sharp negative peak at 200 nm, indicating significant random coil formation (Figure 2B). Interestingly, SBP-PEG₄ shows a stronger shoulder around 222 nm, which indicates that the linker could promote α-helix formation. This difference in helicity correlates with a significantly altered binding affinity, suggesting that the secondary structure plays a critical role in binding the spike protein of SARS-CoV-2 and that enhancing the helicity of the peptide could provide even more improved binding affinity. Of note, the SBP-PEG₄ peptide shows low affinity for other viruses. BLI was used to compare binding between the RBDs of SARS-CoV-2, SARS-CoV-1, and MERS (Figure 2C and Figure S10). The peptide shows selectivity for SARS-CoV-2 with significantly higher response compared to SARS-CoV-1, which also binds to the ACE2 receptor. Challenging the peptide with MERS, which does not have an ACE2 binding motif, shows negligible binding. This validates the use of mimetic peptides as capture agents for sensors.

Optimizing SERS Response of Substances to SARS-CoV-2 Spike Protein. SERS performance is dependent on successful peptide modification of the substrate, which requires a clean gold surface. Heating the substrates to 170 °C helps remove unwanted contaminants before peptide modification, resulting in a reduced SERS background (Figure S11). XPS (Figure S11) and SEM images (Figure S5) show that heating does not damage the substrates. Optimal surface functionalization conditions include the reduction of disulfide bonds between peptide molecules using TCEP and backfilling the surface with 2-mercaptoethanol to orient the peptide more uniformly31 on the surface and yield cleaner SERS spectra (Figure S12). The SERS measurements of the SBP and SBP-
PEG₄ peptide-modified gold SERS substrates confirm successful attachment of the peptides to the surfaces (Figure 3A). The SERS spectra of peptide-modified surfaces exhibit SERS peaks corresponding to the amino acids in the peptides (Figure 3A). SBP-PEG₄ shows bands at 635, 1002, 1032, 1275, and 1420 cm⁻¹, arising from C–S stretching, symmetric ring breathing of phenylalanine, in-plane bending of phenylalanine, phenylalanine/tyrosine CH₂ wagging, and CH₃ deformation of cysteine, respectively.36–38 Figure 3A further shows that the SARS-CoV-2 spike protein elicits significant changes in the observed SERS spectrum. When treated with the SARS-CoV-2 spike protein, the SBP-PEG₄ surface shows more significant and additional spectral changes compared to the peptide without the spacer (Figure 3A), in agreement with its higher binding affinity for the RBD (Figure 2).

Addition of the spike protein to the SBP-PEG₄ surface shows peaks assigned to the protein: C–H stretching or N–H deformation at 793 cm⁻¹, phenylalanine out-of-plane bending at 842 cm⁻¹, α-helical skeletal vibration at 946 cm⁻¹, C–N stretching at 1103 cm⁻¹, tyrosine vibration at 1175 cm⁻¹, C–C stretching of tyrosine and phenylalanine at 1223 cm⁻¹, tryptophan rocking at 1267 cm⁻¹, amide III α-helix vibration at 1293 cm⁻¹, tryptophan CH₃ deformation at 1339 cm⁻¹, CH₃ symmetric stretching at 1369 cm⁻¹, NH₃⁺ deformation of lysine at 1526 cm⁻¹, indole ring of tryptophan at 1559 cm⁻¹, tryptophan aromatic ring stretching at 1580 cm⁻¹, and phenylalanine or tyrosine C–C ring stretching at 1601 cm⁻¹.36,37,39–41 These assignments are consistent with the structure of the spike protein and its RBD.35

The observed SERS features in conjunction with the BLI data indicate that SBP-PEG₄ is the preferred capture molecule. The SERS signatures of SARS-CoV-2 RBD versus the full spike protein on an SBP-PEG₄ surface show a high degree of similarity (Figure 3B), suggesting that the majority of the signal from the full spike originates from the RBD.42–44

As noted in Figure 3B, addition of either the spike or the RBD triggers the appearance of similar peaks (highlighted in maroon), such as the bands around 1600 cm⁻¹ from tryptophan, along with changes in the relative intensities of bands from the peptide itself (highlighted in teal), supporting a change in orientation associated with protein binding.

The SBP-PEG₄ surface demonstrates specificity for SARS-CoV-2 RBD, as opposed to the RBD of two other human coronaviruses, SARS-CoV-1 and MERS-CoV, in agreement with the previously discussed BLI results. In Figure 4, the sensor yields an intense SERS signal from 5 μM SARS-CoV-2 RBD but no response from SARS-CoV-1 RBD and MERS-CoV RBD under the same conditions.

**Figure 3.** SERS detection of SARS-CoV-2 spike protein and RBD on peptide-modified substrates. (A) SERS spectra of the unmodified substrate and of both peptide-modified substrates before and after addition of 2 μM spike protein. (B) Comparison of SERS signal from the SBP-PEG₄-modified surface and in the presence of 2 μM RBD and 2 μM full spike, with highlighted regions indicating important spectral similarities associated with the spike/RBD (maroon shading) and SBP-PEG₄ (teal shading). The spectra are offset for clarity.

**Figure 4.** Specificity of the SBP-PEG₄ SERS sensor for SARS-CoV-2 RBD (blue) versus SARS-CoV-1 RBD (red) and MERS-CoV RBD (orange). The peptide surfaces (teal) prior to treatment with each RBD (5 μM) are shown below each spectrum, respectively. The spectra are offset for clarity.

**Evaluating Selectivity and Quantitative Capabilities of the SERS Sensor.** Figure 5 shows the SERS spectra obtained from SBP-PEG₄-functionalized substrates treated with either 2 μM spike protein, 15 μM bovine serum albumin (BSA), or a spike and BSA mixture. BSA was mixed with the SARS-CoV-2 spike protein in an 8:1 ratio to mimic the protein-rich environment of saliva and blood. In all of these experiments, the SERS signal was acquired from each SBP-PEG₄-modified surface before and after treatment with protein. In Figure 5A, the SERS spectrum in the presence of spike protein shows distinct differences from the peptide-modified surface, notably the feature around 1600 cm⁻¹ (as indicated by the maroon box in Figure 5A), which is likely associated with tryptophan residues present in the RBD of the spike protein but not present in SBP-PEG₄. These differences are unique to the surfaces containing spike proteins and are not observed in the presence of BSA alone. This competition assay assessed the selectivity of the SBP-PEG₄-modified surface, demonstrating the advantage of the capture peptide.

MCR was used to generate a model capturing the spectral changes observed from the spike protein binding to the SBP-PEG₄-modified SERS substrate. The stochastic nature of molecules interacting with hotspots on the surface is known to produce some variance in the SERS spectra. MCR generates components representative of the average spectra observed in all the data. The calibration data consisted of SERS maps from an SBP-PEG₄-modified SERS substrate challenged with a high
concentration of the spike protein, generating a two-component model. The loadings derived from the MCR model are consistent with the spectral changes observed from the spike protein (Figure 5B) and the SBP-PEG4-modified SERS substrate (Figure 5C). The strong spectral feature between 1500 and 1600 cm$^{-1}$ in the loading for the second component (Figure 5B) correlates to a similar feature present in the average spectra of the spike-containing samples (Figure 5A). The emergence of signal in this region appears to be the key indicator of spike binding. Data collected on four different days across four different substrates, which produced a total of five spike maps, five BSA maps, eight mixture maps, and 18 maps with no protein, were analyzed with the resulting model. During the process, Grubbs’ test removed one out of the 18 total peptide maps as an outlier from the validation set. Figure 5D shows that the addition of both the spike and the spike/BSA mixture causes a statistically significant increase ($p < 0.0001$) in the sample’s score on the spike protein component compared to the surface with no protein. Meanwhile, Figure 5E shows that the scores on the peptide component do not change upon the addition of the protein solutions. The data also exhibits a significant difference ($p = 0.05$) between the BSA-treated and the spike-treated samples on the spike component. The score of BSA on the spike component likely represents the small amount of overlap between an off-target protein SERS signal and the SERS spectra of the spike protein, validating that the peptide provides the sensor with selectivity for the SARS-CoV-2 spike protein. Upon addition of the mixture and subsequent rinsing of the surface, the BSA is likely washed away, while the spike protein remains bound to the peptide on the surface. Additionally, the BSA may promote binding of the spike protein to the peptide, as indicated by the similar spike component scores of the 2 μM spike and the mixture containing only 1 μM spike. BSA is typically used as a blocking agent to prevent nonspecific adsorption; however, since the surface is modified with both a peptide and a backfilling agent, this surface effect is unlikely to affect binding. Instead, the BSA may be acting as a molecular chaperone for the spike protein, preventing aggregation and encouraging
proper folding,46 thus ensuring conditions conducive to peptide-spike binding.

It is important to note that this sensor is designed to mimic the ACE2 receptor found in humans and that the model selects for the spike protein of SARS-CoV-2. Because variants of the virus are expected to also infect cells through the ACE2 receptor, this sensor is expected to also bind to the variants. For the sensing of variants, the model may need to be retrained, particularly in the case where the RBD in the variant is altered.47−49

Finally, the SBP-PEG4-modified surfaces demonstrate a linear SERS response as a function of SARS-CoV-2 spike protein concentration. SERS maps were acquired from SBP-PEG4 substrates treated with five different concentrations of spike protein. We observed that the heterogeneity of the SERS substrate required analysis of an average response from a 10 μm × 10 μm area for reliable detection. This could also be achieved with a larger illumination area in a practical device. The spectra from five maps from each surface were averaged and normalized to the height of the phenylalanine peak at 1002 cm⁻¹ as an internal standard (Figure 5F). The average scores for the normalized spectra on the previously discussed MCR model (Figure 5B,D) generated a calibration curve (Figure 5G) for the SARS-CoV-2 spike protein on the SBP-PEG4-modified surface, giving a limit of detection (LOD) of 300 nM. Here, LOD is calculated as 3Sy/mm, where Sy is the standard deviation in y and m is the slope of the calibration curve. The SBP-PEG4 sensor has an LOD about two times lower than that of an unmodified surface (Figure S13) and demonstrates better selectivity, as shown by the competition assay (Figure 5).

## CONCLUSIONS

The use of a SERS substrate modified with a virus-capture peptide provides selective detection of SARS-CoV-2 proteins in complex media. From starting with a clean surface to implementing an effective target-binding sequence, designing a functional peptide-based SERS sensor requires careful attention to detail and consideration of several factors. Notably, using a linker to offset the protein-binding sequence of the peptide from the surface impacts binding, potentially by altering the conformation of the peptide. The SBP-PEG4 SERS sensor shows improved detection of the SARS-CoV-2 spike protein at lower concentrations compared to the unmodified surface. Consistent with previous findings, the SERS signal of this protein appears to be derived from the RBD. Variants of the SARS-CoV-2 virus are reported to have mutations in the RBD,47−49 but since SBP-PEG4 mimics the natural binding site of the virus, this SERS sensor will likely still bind these variants, and the model could be retrained to detect them without engineering a new sensor. Overall, the improved LOD and the selectivity of the sensor provide the basis for the utilization of a peptide-based SERS assay for detecting SARS-CoV-2 as well as other emerging viruses in the future.

## ASSOCIATED CONTENT

* Supporting Information*

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acssensors.1c01344.

Peptide names and sequences, Cys-SBP peptide, Cys-PEG4-SBP peptide, XPS of RBD binding SBP substrate, confocal images of immunolabeled substrates, SEM of SERS substrates before and after modification, SEM of immunolabeled substrate, biotin-SBP peptide, biotin-PEG4-SBP peptide, BLI kinetics, peptide specificity BLI curves, XPS and SERS characterization of heat cleaning substrates, SERS characterization of backlighting, and SERS response of spike protein on unmodified substrates (PDF)

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### Author Contributions

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### Notes

The authors declare the following competing financial interest(s): We have a patent pending related to this manuscript.

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