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# Elucidating the Influence of Materials-Binding Peptide Sequence on Au Surface Interactions and Colloidal Stability of Au Nanoparticles

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## ABSTRACT

Peptide-mediated synthesis and assembly of nanostructures opens new routes to functional inorganic/organic hybrid materials. However, understanding of the many factors that influence the interaction of biomolecules, specifically peptides, with metal surfaces remains limited. Understanding of the relationship between peptide sequence and resulting binding affinity and configurations would allow predictive design of peptides to achieve desired peptide/metal interface characteristics. Here, we measured the kinetics and thermodynamics of binding on a Au surface for a series of peptide sequences designed to probe specific sequence and context effects. For example, context effects were explored by making the same mutation at different positions in the peptide and by rearranging the peptide sequence without changing the amino acid content. The degree of peptide-surface contact, predicted from advanced molecular simulations of the surface-adsorbed structures, was consistent with the measured binding constants. In simulations, the ensemble of peptide backbone conformations showed little change with point mutations of the anchor residues that dominate interaction with the surface. Peptide-capped Au nanoparticles were produced using each sequence. Comparison of simulations with nanoparticle synthesis results revealed a correlation between the colloidal stability of the Au nanoparticles and the degree of structural disorder in the surface-adsorbed peptide structures for this family of sequences. These findings suggest new directions in the optimization and design of biomolecules for *in situ* peptide-based nanoparticle growth, binding, and dispersion in aqueous media.

**KEYWORDS.** bionanocombinatorics, peptides, thermodynamics, affinity/specificity, Au nanoparticles

## INTRODUCTION

Exploiting materials recognition properties of biomolecules could allow the creation of functional nanoassemblies that incorporate both inorganic and organic components.<sup>1-3</sup> In particular, bionanocombinatorics is an emerging field that aims to control the assembly of nanomaterials using biological interactions. Peptides provide a unique pathway to achieving this objective. For peptides that bind to inorganic surfaces through multiple noncovalent interactions, both enthalpic and entropic components of binding affinity must be considered when predicting and interpreting binding behavior.<sup>4</sup> Biocombinatorial selection techniques used to identify material-binding peptides generally select for overall binding affinity and do not provide information on the components of binding affinity separately. Based on their binding affinity, such peptides have been used to cap and direct the growth of various inorganic nanoparticles under mild conditions.<sup>5-7</sup> Specifically, Au nanoparticles are of high interest due to their potential applications in catalysis,<sup>8-10</sup> energy harvesting and storage,<sup>11,12</sup> sensors,<sup>13,14</sup> optics/plasmonics,<sup>15,16</sup> and as components in nanoassemblies.<sup>17-19</sup> Additionally, Au nanoparticles exhibit a localized surface plasmon resonance (LSPR), which provides a simple means of detecting changes in the size, shape, and aggregation state of the nanostructures via changes in the LSPR optical extinction spectrum.

While experimental measurements of peptide binding affinity for a target surface are possible, experimentally characterizing the peptide-metal interface at the molecular level is difficult, if not impossible. As a result, molecular simulation approaches, along with complementary experimental data, are essential for separating out enthalpic and entropic contributions of peptide binding, elucidating configurations of the peptide-metal interface, and linking these to the peptide-surface binding affinity. We previously demonstrated that material-

binding peptides can be categorized as either enthalpically- or entropically-driven binders.<sup>4</sup> Enthalpically driven material-binding peptides tend to have several anchor residues (those residues with strong and persistent non-covalent interactions with the surface) spaced throughout the sequence. These anchor the biomolecule to the surface, resulting in a limited number of surface-binding configurations. However, strong materials-binding affinity can also arise from the presence of a large number of relatively-weakly-bound adsorbed peptide configurations. Such entropically-driven binding peptides have fewer anchor residues, allowing them to adopt many different binding conformations on the inorganic surface.<sup>4</sup> The conformational entropic contribution to binding associated with the large number of possible configurations contributes to higher binding affinity with fewer strong anchor residues compared to enthalpically driven binders.

We previously classified the Pd4 peptide (TSNAVHPTLRHL), originally isolated based on its affinity for Pd,<sup>20</sup> as an entropically driven binder on Au.<sup>4</sup> This sequence contains only two anchor residues (His6 and His11), resulting in many distinct surface-adsorbed conformations. In comparison, other sequences such as AuBP1 (WAGAKRLVLRRE) and AuBP2 (WALRRSIRRQSY), originally isolated as Au-binding peptides,<sup>21</sup> were classified as enthalpic binders. They have five and four anchor residues, respectively, with a significantly smaller number of thermally-accessible conformations on Au compared to Pd4.<sup>21</sup> While these broad classifications advanced the understanding of how peptides bind to inorganic surfaces, the effects of the global and local sequence on binding remain poorly understood. In this regard, the importance of sequence, and not just overall residue content, is clearly important; however, how the anchor residues work in concert with neighboring residues or how altering the global sequence of the peptide changes materials binding affinity remain unknown.

Here, Pd4 was employed as a parent peptide to identify the effects of amino acid sequence and the local context of the anchor residues, and to explore how these effects act synergistically to mediate binding affinity for the Au surface. Our modifications included point mutation of histidine anchor residues with alanine (with the aim to diminish localized binding affinity), scrambling of the peptide sequence, and clustering of the anchor residues at the N-terminus (Table 1). The Pd4 peptide was initially studied due to the limited number of anchor residues (two in total)<sup>4</sup> and its known affinity for Au. Peptide binding affinities on Au were quantified using Quartz Crystal Microbalance (QCM) measurements, which revealed significant changes in binding affinity between sequences. This information was combined with findings from advanced molecular simulation studies, in which the Boltzmann-weighted ensemble of adsorbed conformations was predicted for each of the sequences. Taken together, the experimental and computational results reveal underlying causes for the observed variation in peptide-surface binding. We also prepared peptide-capped Au nanoparticles using each sequence and characterized them by UV-vis spectroscopy and transmission electron microscopy (TEM). These results demonstrated that the local context of the anchor residues, as well as the global peptide sequence, plays a key role in controlling material affinity. Understanding of these sequence effects can also be exploited to enhance the quality and colloidal stability of peptide-capped Au nanoparticles. Thus, these studies advance efforts to identify heuristics for the design of peptides with affinity and potential selectivity for inorganic surfaces. The ability to rationally tune the binding strength and binding mode on specific surfaces would be extremely valuable for creating peptide-organized structures for optical, catalytic, and nanoparticle self-assembly applications.

## MATERIALS AND METHODS

**Chemicals.** All Fmoc-protected Wang resins, Fmoc-protected amino acids, *N,N'*-diisopropylethylamine (DIPEA), piperidine, 1-hydroxybenzotriazole hydrate (HOBt hydrate), and *N*-[(1*H*-benzotriazol-1-yl)(dimethylamino)methylene]-*N*-methylmethanaminium hexafluorophosphate *N*-oxide (HBTU) were purchased from Advanced ChemTech. *N,N'*-dimethylformamide, methanol, diethyl ether, ammonium hydroxide (20%), and hydrogen peroxide (30%) were obtained from BDH Chemicals, while trifluoroacetic acid (TFA) and triisopropylsilane (TIS) were acquired from Alfa Aesar. HAuCl<sub>4</sub> and NaBH<sub>4</sub> were purchased from Sigma-Aldrich and Acros Organics, respectively. Finally, acetonitrile was purchased from EMD Millipore. All chemicals were used as received without further purification. Milli-Q water (18 MΩ·cm) was used for all experiments.

**Peptide Synthesis.** Peptides were generated using a TETRAS peptide synthesizer (CreoSalus) following standard solid-phase Fmoc protocols.<sup>22</sup> A cleavage cocktail of 95% TFA, 2.5% TIS, and 2.5% water was employed to cleave the peptides from the resins. The crude peptides were purified via reversed-phase high performance liquid chromatography (HPLC) with a 0.1% TFA aqueous solution and acetonitrile gradient. Finally, the purified peptides were confirmed by matrix-assisted laser desorption/ionization time-of-flight (MALDI-TOF) mass spectrometry. All peptide solutions were lyophilized and stored at -80 °C prior to use.

**QCM Analysis.** All QCM measurements, including those for dissipation energy, were conducted on a Q-Sense E4 instrument (Biolin Scientific) following previously reported procedures.<sup>23</sup> Standard polycrystalline gold crystal sensors were employed and cleaned according to manufacturer protocols prior to use. In brief, the gold QCM sensors were first subjected to UV-ozone exposure, followed by immersion in a 5:1:1 (v/v/v) water/ammonium hydroxide/hydrogen

peroxide solution and an additional UV/ozone treatment. Afterward, an aqueous peptide solution at a concentration between 2.5 to 15.0  $\mu\text{g/mL}$  was flowed over the sensor surface at a rate of 150  $\mu\text{L/min}$ . The frequency change and dissipation energy were recorded for 30 min to ensure saturation. This frequency change is directly related, via the Sauerbrey equation, to the mass of peptide adsorbed, from which binding kinetic parameters can be determined.<sup>24</sup> All measurements were performed at 22.5 °C, and the pH of the peptide solutions ranged from 3.9 – 4.2.

**Molecular Simulations.** To investigate the effect of the variations of the parent Pd4 peptide sequence on the peptide-surface adsorption, the conformational ensemble of the adsorbed peptides was predicted using Replica Exchange with Solute Tempering (REST)<sup>25,26</sup> molecular dynamics (MD) simulations. Each simulation comprised a single peptide chain adsorbed at the Au(111) interface (represented by a five-layer Au slab) in the presence of liquid water. Three-dimensional periodic boundary conditions were applied throughout. The polarizable GōIP-CHARMM force-field,<sup>27,28</sup> the CHARMM22\* force-field,<sup>29,30</sup> and the modified TIP3P potential<sup>31,32</sup> were used to describe the interactions involving the Au surface, the peptide, and water, respectively. All REST simulations were performed at a thermal temperature of 300 K. Additional details about the simulation procedures and analysis of the simulation trajectories are provided in the ‘Additional Methodology’ Section in the Supporting Information. Note that previous studies<sup>33</sup> have shown that the binding modes of peptide sequences at the described planar surface are very similar to the binding modes on Au NPs dispersed in solution. Thus REST simulations of peptides at the aqueous Au (111) interface are able to provide useful insight into the principal contact modes and conformational entropic contributions of the same peptide adsorbed onto the surface of Au NPs, which is in turn related to colloidal stability of the Au NPs.



Special attention was paid to the protonation state of the histidine residues (see Results and Discussion). For the original sequence and each mutated sequence (see Table 1), we separately considered the deprotonated (charge-neutral) and protonated (positively-charged) states of each histidine present in that sequence. For each sequence that contained only one histidine, this resulted in two different REST simulations: one with the histidine modeled as protonated (denoted PS1) and one with the histidine deprotonated (denoted PS0). For sequences with two histidines, this resulted in four different REST simulations: 1) no histidines protonated (denoted PS0), 2) only the first histidine in the sequence protonated (denoted PS1A), 3) only the second histidine in the sequence protonated (denoted PS1B), and 4) both histidines protonated (denoted PS2). In summary, we performed a total of seventeen REST simulations to cover all possibilities for the mutant sequences.

**Au Nanoparticle Synthesis.** Peptide-capped Au nanoparticles were prepared according to synthetic methods established by Li *et al.*<sup>8</sup> The fabrication of peptide-capped Au nanoparticles with a Au:peptide ratio of 2 is described; however, changes to the reagent volumes (to equal a total volume of 5.0 mL) were employed to reach the appropriate metal loading. In detail, 500  $\mu\text{L}$  of an aqueous 1.0 mM peptide solution was added to 4.460 mL of water in a vial. Next, 10  $\mu\text{L}$  of an aqueous 100 mM  $\text{HAuCl}_4$  solution was added. The solution was briefly agitated and allowed to stand for 10 min. This was followed by the addition of 30  $\mu\text{L}$  of a freshly prepared aqueous 100 mM  $\text{NaBH}_4$  solution. A  $\text{NaBH}_4$ :Au ratio of 3 was used for all syntheses. The solution was briefly agitated, and the reaction was allowed to proceed undisturbed at room temperature for 1.0 h to ensure complete reduction. Identical synthetic protocols were used to prepare Au nanoparticles at a Au:peptide ratio of 1:1; however, the amount of the stock  $\text{HAuCl}_4$  solution was

decreased to 5  $\mu$ L and the water volume was increased to reach a final reaction volume of 5.0 mL.

**Nanoparticle Characterization.** TEM studies were performed using a JEOL JEM-2010 microscope operating at 200 kV. The samples were prepared by drop casting 5  $\mu$ L of the colloidal nanoparticle dispersion onto a carbon-coated 200 mesh Cu grid, which was allowed to dry overnight. UV-vis monitoring of particle formation and aggregation employed an Agilent 8453 photodiode array spectrophotometer. All samples were analyzed using a quartz cuvette with a 1 cm optical path length.

## RESULTS AND DISCUSSION

**QCM Analysis of Peptide Binding to Au.** Pd4, originally isolated as a Pd-binding peptide,<sup>20</sup> also binds to Au.<sup>4,8</sup> Our previously-published molecular simulations predicted that the native Pd4 peptide has two anchor residues for Au binding, specifically two histidines at the 6 and 11 positions.<sup>4</sup> To elucidate effects of sequence and anchor residue context on peptide binding, a set of six different Pd4 variant peptide sequences was prepared (Table 1). More specifically, to understand how the binding thermodynamics change when one or both of the anchor residues is removed, two peptides, Pd4-1 and Pd4-2, were prepared in which a single histidine residue was replaced with alanine at the 6 or 11 position, respectively. A doubly mutated peptide, Pd4-3, was generated with both histidines replaced by alanines. Previous predictions of amino acid binding free energies on aqueous Au(111) suggested that alanine is not a strong binder.<sup>17</sup> Thus, minimal Au surface binding at the alanine sites was anticipated. However, these sequences were designed to probe how the local context of anchor residues affected the surface conformation and Au-binding affinity of the peptide. To probe the effects of the global sequence for Au binding

behavior (*i.e.* to test the possibility that overall binding affinity is just a summation of the individual residues' affinities, in which details of the sequence play no role in binding), two additional peptides were designed: the Pd4-4 sequence (a random rearrangement of the residues present in the native Pd4 peptide) and the Pd4-5 peptide (which has the two histidine anchors grouped together at the N-terminus).

QCM analysis was used to determine peptide binding kinetics and thermodynamics for each sequence. Figure 1a presents the observed frequency changes for the Pd4-5 peptide at five different concentrations as an example. The full QCM analysis for all of the peptides is presented in the Supporting Information, Figure S1. Higher peptide concentrations produced faster frequency changes, reflecting increased binding rates. The dissipation energy, which is an indicator of the viscoelasticity of the bound peptide layer, is shown for the highest peptide concentration (15  $\mu\text{g/mL}$ ). For all of the peptides studied here, the dissipation energy was <5% of the total frequency change. This indicates that the adsorbed peptide layer was rigid, and that multiple layers were not formed. Note that for all QCM data, inverted plots are displayed for more intuitive data interpretation.

Fitting each QCM-derived binding curve to Langmuir kinetics provided pseudo-first order adsorption rate constants ( $k_{\text{obs}}$ ) as in prior studies.<sup>4,23,24</sup> Plotting the  $k_{\text{obs}}$  values as a function of the peptide concentration gives the binding constants for adsorption ( $k_{\text{a}}$ ) and desorption ( $k_{\text{d}}$ ) as the slope and  $y$ -intercept of the best fit line of the plot, respectively (Figure 1b). Using these values, the binding equilibrium constant,  $K_{\text{eq}}$ , can then be calculated as  $k_{\text{a}}/k_{\text{d}}$ . The binding affinity, defined as the Gibbs free energy change ( $\Delta G$ ) for peptide binding, is then obtained as  $\Delta G = -RT \ln(K_{\text{eq}})$ . Using this approach, the  $\Delta G$  of binding for the Pd4-5 peptide on Au was determined to be  $-35.5 \pm 0.2$  kJ/mol. This analysis was carried out for each of the peptides in the

designed library to yield the  $\Delta G$  values presented in Table 1. These ranged from  $-27.2$  to  $-35.5$  kJ/mol for the weakest (Pd4-1) and strongest (Pd4-5) binders, respectively. Note that the pH of the peptide solutions for the QCM analysis ranged from 3.9 to 4.2. A full summary of the  $k_a$ ,  $k_d$ , and  $K_{eq}$  values for each peptide is provided in Table S1 of the Supporting Information. The native Pd4 peptide has a  $\Delta G$  value of  $-31.4 \pm 0.1$  kJ/mol. This value is similar to values reported in previous studies of Pd4 binding on Au.<sup>4</sup> When a single histidine was replaced by alanine, as in Pd4-1 and Pd4-2, lower  $\Delta G$  values of  $-27.2 \pm 0.2$  kJ/mol and  $-30.7 \pm 0.1$  kJ/mol, respectively, were measured. This indicates that mutation of the individual histidine anchor residues does substantially affect the Au affinity; however, the effect was larger for the residue at the 6 position. When histidines at both the 6 and 11 positions were replaced with alanines (Pd4-3), we observed an unexpected increase in the Au binding affinity ( $\Delta G = -32.0 \pm 0.8$  kJ/mol). Note that while the average  $\Delta G$  values for Pd4 and Pd4-3 are different, the error limits for the measured values overlap. The relatively strong affinity of Pd4-3 was surprising; mutation of a second anchor residue (histidine) would be expected to further decrease the binding affinity, given the decreases observed upon replacement of either of the anchor residues individually. Finally, an increase in binding affinity was noted for the remaining two peptide variants, Pd4-4 and Pd4-5. A  $\Delta G$  value of  $-33.1 \pm 0.2$  kJ/mol was determined for the Pd4-4 peptide, while the strongest binding of the set was observed from the Pd4-5 peptide. The weakest binding was observed from the Pd4-1 peptide.

From Langmuir fitting of the QCM data, the steady-state fractional surface coverage,  $\theta$ , of the sensor by the peptide can also be directly determined.<sup>4</sup> For the Pd4-5 peptide at the highest concentration studied (15  $\mu\text{g/mL}$  peptide), the surface coverage reached a maximum value of

$95.3 \pm 0.4\%$ , consistent with its strong binding affinity. At the other extreme of binding affinity, Pd4-1 at the same concentration had a maximum surface coverage of  $41.2 \pm 1.6\%$ .

**Molecular Dynamics Simulations of Peptide binding to Au.** The conformational ensemble of adsorbed peptide states provided by our molecular simulation data allows for conceptual links to be established between the primary sequence of the peptide, the observed experimental binding data, and the predicted structure(s) of the peptide in the adsorbed state. One additional challenge in predicting the conformational ensemble of the Pd4 sequence and its variants is associated with the presence of His residues. In the amino acid form, the side-chain in histidine is likely to be protonated (*i.e.* carry an overall +1 charge) in aqueous solution at the pH values investigated experimentally (pH 3.9 – 4.2); the relevant  $pK_a$  value is  $\sim 6.2$  for the imidazole side-chain. However, the  $pK_a$  corresponding to protonation of the side-chain of a His residue in a peptide sequence in solution may differ substantially from that of the corresponding amino acid.<sup>34</sup> This is due to the modification in the immediate dielectric environment of the relevant His in a protein/peptide, which can depend on the conformational state (or ensemble of states) of the protein/peptide. For example, the degree to which the residue is shielded from water, based upon the biomolecular structure, can substantially effect the localized dielectric environment around the histidine, thus potentially altering the protonation state of the imidazole side chain.<sup>35,36</sup> Moreover, the relevant  $pK_a$  of a His residue in the surface-adsorbed state at the aqueous Au interface might also differ from that of a free (*i.e.* un-adsorbed) peptide in solution.

At present, the prediction of  $pK_a$  values for residues such as His for peptides/proteins in aqueous solution, which can account for environment/conformation effects, is extremely challenging.<sup>37</sup> Going further, to the authors' knowledge, information regarding the influence exerted by the presence of the aqueous Au interface on the  $pK_a$  of His residues in surface-bound

peptide is also scarce. Therefore, the protonation state of each His residue in the surface-adsorbed state of the peptide may not match expectations based on the known  $pK_a$  values generated for the His amino acid.

These questions discussed above represent a grand challenge in molecular simulation and are not the focus of the present study. Herein, we only consider how the conformational ensemble of the surface-adsorbed peptide sequences can be modulated by the protonation state of each His residue. As will be demonstrated, the position and local environment of each His residue, in addition to the protonation state of the His side-chain, can all influence this conformational ensemble. Therefore, in the REST simulations, each protonation state of each His residue for every peptide sequence that contained any His residues (*i.e.* Pd4, Pd4-1, Pd4-2, Pd4-4 and Pd4-5) was considered. These sequences comprise a special case in the simulation dataset; however, unless specified otherwise, the results discussed below will refer to the case where all the His in the sequence were protonated. Snapshots of representative structures of the Pd4-1 and Pd4-5 peptides, which are the two peptides that feature the greatest difference in terms of the QCM-measured binding affinity, are shown in Figure 2. Corresponding snapshots of the other peptides are shown in Figures S4-S7 in the Supporting Information.

As mentioned above, our previously-published simulation studies on the adsorption of Pd4 at the aqueous Au interface have identified Pd4 as an entropically-driven binder,<sup>4</sup> *i.e.* that Pd4 supports a large number of distinct conformations in the surface-adsorbed state. The number of distinct surface-adsorbed conformations of a peptide can be determined from a clustering analysis,<sup>38</sup> where like structures are grouped together on the basis of peptide backbone conformational similarity (denoted herein as clusters). From this cluster analysis, both the total number of distinct adsorbed conformations,  $n$ , and their relative population,  $p_i$ , can be

determined. As introduced in earlier studies,<sup>17,39</sup> the conformational entropic contribution,  $S_{\text{conf}}$ , associated with the surface-adsorbed peptide can then be estimated from:

$$S_{\text{conf}} = \sum_{i=1}^n -p_i \ln(p_i)$$

These  $S_{\text{conf}}$  values are summarized in Table S5 in the Supporting Information; the actual values of the number of total number of distinct conformations (referred to as clusters),  $n$ , and the populations,  $p_i$  for the top-ten most populated clusters, are also provided in Table S3 of the Supporting Information. In terms of a relative  $S_{\text{conf}}$  score, the native Pd4 sequence was previously ranked as high.<sup>4</sup> The current data show that almost all of the variants of the Pd4 sequence could also be classified as high in terms of  $S_{\text{conf}}$  score. In the case of three of the variants, Pd4-1, Pd4-2, and Pd4-4, the conformational entropy contribution was substantially enhanced relative to the parent sequence (see Table S5 of the Supporting Information).

In addition, the adsorbed configurations of each variant sequence were compared in terms of structural similarity against those obtained for the parent peptide sequence. If the root mean-squared deviation (RMSD) between the relative positions of the peptide backbone atoms inherent to the representative structures of the two clusters was less than or equal to 2 Å (the same spatial cut-off used for the clustering analysis, see ‘Additional Methodology’ in the Supporting Information) then the two conformations were classified as a match, *i.e.* the peptide backbone conformations were similar. The top-ten most populated clusters of the parent peptide have thus been compared against the ten most populated clusters of each of the variants (see Supporting Information, Table S4). Both the Pd4-1 and Pd4-3 sequences shared reasonable structural similarity with the original Pd4 sequence (*i.e.* both Pd4-1 and Pd4-3 possess several matched structures with Pd4). In particular, the most populated cluster of Pd4-1 and Pd4-3 both have a structural match with the most populated cluster of Pd4. Pd4-2 had fewer matching

conformations with Pd4 but still featured one match between clusters with a non-negligible population. These findings suggest that the Pd4 sequence possesses conformational stability. In other words, Pd4 shows a lack of conformational susceptibility with regards to the mutation of individual residues, even if those residues are anchors. These results do not necessarily suggest a general finding; for example, this may only hold for entropically-driven materials-binding peptides. Further comprehensive and systematic investigations are needed to fully elucidate the rules governing this phenomenon. The more substantial changes to peptide sequence inherent to the other two mutants (Pd4-4 and Pd4-5) resulted in few or no matches with Pd4, respectively. Overall, the extensive conformational ensemble identified for all six peptide sequences, combined with the conformational recalcitrance of the sequences corresponding with point mutations, indicates that the underlying explanation for the differences in the experimentally-measured binding affinities is related to the anchor residues, *i.e.* the histidines.

Figure 3 shows the predicted degree of direct Au surface contact calculated for each residue in each of the six peptides, in the instance where all His residues are protonated. Figure S8 in the Supporting Information shows the residue-surface contact averaged over different configurations of the protonation states, while the numerical contact data (as percentages) are provided in Table S2 of the Supporting Information for all possible combinations of histidine protonation state for every sequence. From these data, the anchor residues can be identified and the degree to which the mutations of the peptide chain alter the binding of residues within the peptide can be assessed. For the parent Pd4 sequence, H6 and H11 are anchor residues in all protonation state scenarios (Table S2 in the Supporting Information). At pH 4, R10 is also an anchor residue. Overall, the peptide is predicted to be adsorbed to the Au surface at two locations in the sequence: in the middle of the chain and close to the C-terminus of the chain. In Pd4-1 the



H6A mutation generates a change in the residue-surface contact of the peptide (Figure 3 and Table S2 in the Supporting Information). In this case, the A6 residue showed only weak contact with the Au(111) surface, while the A4 residue became an anchor. Interestingly, this is the only non-His/Arg residue that acted as an anchor in all the systems considered. At the C-terminal end of Pd4-1, H11 remained an anchor residue but R10 did not. However, the enthalpic contribution of A4 to the overall peptide binding strength is predicted to be considerably less than that of a His or Arg residue.<sup>17,27,28,40,41</sup> In summary, when compared to Pd4, Pd4-1 suffered a reduction from two strong anchor residues (in Pd4) to one strong anchor (H11) and one weak anchor (A4), which may explain why the measured binding affinity of Pd4-1 is weaker than Pd4.

In the case of Pd4-2, the H11A mutation is seen to exert less effect on the surface contact points along the peptide chain. H6 remained an anchor (regardless of protonation state, see Table S2 in the Supporting Information); in addition, despite the (expectedly) weak binding of A11, R10 assumed the role of the sole strong surface contact point in the C-terminal region of the chain. Both His and Arg are thought to be strong binding residues at the aqueous Au interface.<sup>4</sup> We propose that for a dyad sequence motif where His and Arg are adjacent in the sequence (*i.e.* either HR or RH), this can lead to a competition between the two residues in determining which residue acts as the surface contact point. However, this competition to act as an anchor appears to also be influenced by the His protonation states (see data for Pd4 and Pd4-4 in Table S2 of the Supporting Information).

The mutation of both His residues in Pd4-3 removed two anchor points. Intuitively, this would suggest that Pd4-3 should bind more weakly than Pd4; however, as seen for Pd4-2, R10 again assumed the role as anchor residue in the absence of H11. Moreover, while Pd4-3 did not feature any additional anchor residues, this sequence did however exhibit a substantial

contiguous segment (N3-P7) that featured moderate binding. For the Pd4 parent, the surface contact for residues in the N3-P7 segment varies with the protonation state of the His residues (Table S2); if the contact is averaged over all the possible protonation states (Figure S8), the contact of the N3-P7 segment in Pd4-3 is comparable to that of Pd4. In particular the contact of the N3-A4-V5 triad is higher in Pd4-3 than the parent peptide. The probability of at least two of these three residues being adsorbed simultaneously is 51 and 35% for Pd4-3 and Pd4, respectively. This, in partnership with the anchor at R10, could in part account for the similarity in binding strength of Pd4-3 compared with Pd4. Despite the scrambling of the sequence in Pd4-4, both of the His residues and the Arg residue all remained as anchors for three out of the four His protonation configurations considered here. While we cannot determine the relative weighting of these four protonation configurations in the overall ensemble of Pd4-4, a naïve averaging of the number of anchors over the four states suggests a greater number of anchor points compared with the corresponding analysis for Pd4. This assumption is reasonable given the lack of certainty regarding the  $pK_a$  of each His residue when the peptide is adsorbed at the aqueous Au interface. These results are consistent with the experimentally-observed binding constants.

The data from the QCM experiments indicate that Pd4-5 was the strongest binder to Au. For the doubly-protonated state (where both His are protonated), at first glance it may seem counter-intuitive that Pd4-5 featured only one single strong anchor residue, R11. However, further analysis (see a summary of conditional residue-surface binding probabilities in Table S6 of the Supporting Information) demonstrated that the majority (92%) of the simulation trajectory had at least one of the His residues also in contact. In other words, a competitive binding scenario, similar to that seen for RH/HR, was also noted for the HH dyad motif, where the

binding of the two His residues was seen to toggle. Our analysis confirmed that only 8% of the trajectory featured neither of the His residues in a surface-bound state. Therefore, any given adsorbed conformation of doubly-protonated Pd4-5 was likely to have at least two strong surface contact points (R11 and either H1 or H2, or all three residues), as indicated in Figure 2b. As with Pd4-4, the relative proportion of each protonation configuration is unknown, but again, an unweighted average over states suggests that Pd4-5 had a greater average number of anchors than did Pd4. This could in part explain the stronger binding affinity observed for Pd4-5.

**Au Nanoparticle Synthesis and Characterization.** With a clearer understanding of the binding between the Au surface and the peptides of Table 1, Au nanoparticles were fabricated using the biomolecules as capping ligands. For nanoparticle synthesis, each peptide was mixed with Au<sup>3+</sup> ions at Au:peptide molar ratios of 1:1 and 2:1. After allowing time for complexation of the metal ions to the peptide, each solution was reduced with a 3-fold molar excess of NaBH<sub>4</sub> relative to Au<sup>3+</sup>. In all cases, a dramatic color change was observed upon reduction. The absorbance of the nanoparticle dispersions was characterized using UV-vis spectroscopy (Figure 4). Figure 4a specifically presents the parent Pd4 system. The spectrum of the Pd4 peptide solution was featureless, while those of the Au<sup>3+</sup>/peptide complex showed a weak absorbance peak at 300 nm, at both Au:peptide ratios. After reduction, an absorbance peak associated with the Au nanoparticle LSPR was observed. For a Au:peptide ratio of 2, the LSPR absorbance was quite broad and red-shifted relative to the typical position for the LSPR of Au particles. However, when a Au:peptide ratio of 1 was employed, a distinct LSPR band was evident at 525 nm. This suggests that the Au nanoparticles prepared at a ratio of 2 are larger, more polydisperse, and/or more aggregated in solution compared to particles prepared at the lower ratio.<sup>42</sup> Identical analyses were conducted for each of the peptides at both ratios. Overall, for all of the peptide-

capped Au nanoparticles produced at a Au:peptide ratio of 2, the LSPR absorbance was broad and red-shifted, beginning near 580 nm, while at a ratio of 1, the materials typically had a distinct LSPR band that was positioned between 525 and 550 nm.

TEM analysis was conducted to examine the effect of peptide sequence/mutations and the Au:peptide ratio on particle size, shape, and stability. Figure 5 presents TEM images of the Au nanoparticles capped with each of the peptides after 1 h of reduction. The top and bottom rows display the materials prepared at ratios of 2 and 1, respectively. For the Pd4-capped materials fabricated at a ratio of 2, polydisperse particles with an average size of  $7.7 \pm 3.6$  nm were observed, consistent with previous studies;<sup>8,42</sup> however, the particles generated with the alanine-substituted peptides decreased in size to  $5.2 \pm 2.0$  nm (Pd4-1),  $3.9 \pm 1.1$  nm (Pd4-2), and  $5.3 \pm 1.7$  nm (Pd4-3). For the materials capped with the Pd4-4 peptide that randomized the peptide sequence and the Pd4-5 sequence that grouped the histidine anchor residues at the N-terminus, particles of  $5.3 \pm 2.8$  nm and  $4.1 \pm 1.6$  nm were noted, respectively. Overall, all of the modified or mutated peptides generated smaller Au nanoparticles than the parent Pd4 sequence; however, no clear trends with respect to biomolecule binding strength ( $\Delta G$ ) and average particle size were evident. Furthermore, all of the particles were polydisperse in size and overall morphology.

Different results were obtained when the synthesis reactions were carried out at a Au:peptide ratio of 1. Spherical particles with an average diameter of  $3.0 \pm 0.6$  nm (Pd4),  $3.6 \pm 0.9$  nm (Pd4-1),  $2.6 \pm 0.5$  nm (Pd4-2),  $3.5 \pm 1.1$  nm (Pd4-3),  $3.2 \pm 1.1$  nm (Pd4-4), and  $2.7 \pm 0.5$  nm (Pd4-5) were formed at this lower Au:peptide ratio. For all particle sizing, at least 100 particles were measured over multiple TEM images. Size distribution histograms are available in the Supporting Information, Figure S2. The effect of decreasing the Au:peptide ratio on particle size and shape is illustrated in these samples. In general, after 1 h of reduction, using a 2:1 ratio

to prepare the materials gave larger, more polydisperse, and somewhat aggregated particles, while employing a 1:1 ratio produced smaller, more spherical particles. Such effects likely arise from insufficient peptide in solution at the higher ratio (2:1) to passivate the Au nanoparticle surfaces at smaller particle sizes, leading to coalescence of the materials to generate the observed sample. At the smaller ratio (1:1), enough peptide is present in the reaction to cap the growing nanoparticles at the smaller sizes. These results are consistent with the UV-vis spectra of the materials, in which all the structures generated at a ratio of 2, independent of which peptide was used to cap them, displayed a broad and red shifted Au LSPR absorbance relative to the distinct LSPR peak at 525-550 nm for the particles prepared at a ratio of 1.

Figure 6 presents UV-vis and TEM analyses of samples 24 h after reduction. The aggregation process was monitored by measuring the absorbance at the LSPR peak of the Au nanoparticles over 24 h, taking one spectrum every 10 min for 24 h. For the reactions using a Au:peptide ratio of 2, as presented in Figure 6a, aggregation of the particles prepared with Pd4-1, Pd4-2, and Pd4-4 was observed in less than 24 h. Although a significant increase in absorbance was evident initially for the Pd4-3 capped materials, arising from the nucleation and initial growth of the particles, a sharp decrease in the absorbance was noted beginning at 16 h, indicating precipitation was occurring. The Pd4-5 reaction products were stable for the duration of the experiment as seen in the plateau of its LSPR absorbance. Interestingly, the absorbance for the Pd4 particles slowly decreased over 24 h and ended at the same absorbance as the Pd4-3 reaction when it had precipitated; however, the Pd4-capped materials remained stable and dispersed in water. This suggests that the Pd4-capped particles were somewhat aggregated in solution, even though they do not aggregate to a sufficient extent to show visible precipitation. TEM imaging of the Pd4 and Pd4-5 capped materials 24 h post reduction revealed particle sizes

of  $5.5 \pm 2.4$  nm and  $3.7 \pm 2.1$  nm, respectively, which are relatively similar to the particle sizes after 1 h of reduction. When a Au:peptide ratio of 1 was employed, a similar trend was also found in that materials produced using Pd4 and Pd4-5 remained stable over 24 h; however, bulk precipitation was evident in the particles capped with Pd4-1, Pd4-2, Pd4-3, and Pd4-4 peptides (Figure 6b). TEM imaging 24 h after reduction gave identical particle sizes of  $2.7 \pm 0.5$  nm (Pd4) and  $2.7 \pm 0.5$  nm (Pd4-5), which are again similar to the particle sizes after 1 h of reduction.

Overall, no clear trend was evident between the binding strengths of the peptides and the size of the particles produced. For example, Pd4-4 and Pd4-5 have the strongest affinity for Au based upon their  $\Delta G$  values; however, these sequences generated Au nanoparticles with neither the largest or smallest sizes among all the peptides studied. This suggests that additional binding parameters beyond surface affinity govern particle formation and growth using peptides. Interestingly, the Pd4 and Pd4-5 peptides generated nanoparticles that remained stable for more than 24 h at both ratios of 2 and 1, even though their  $\Delta G$  values were very different. This indicates that particle stability depends upon other factors such as the conformation in which the peptide binds to the metal surface, rather than simply the affinity of the peptide for the NP material.

To date, there has been no systematic rationale to understand or predict why a given peptide sequence may or may not produce a stable dispersion of peptide-capped Au nanoparticles in aqueous solution. Aggregation is likely if patches of exposed Au surface are present on two neighboring nanoparticles in solution. This condition is more probable for a peptide/nanoparticle interface that features a high degree of conformational entropic contribution to the binding ( $S_{\text{conf}}$ ), which in turn corresponds with a conformational ensemble of the peptide in the surface-adsorbed state that has a large number of distinct structures and fewer strong anchor

points. In terms of the underlying potential energy landscape that corresponds to a high value of  $S_{\text{conf}}$ , two scenarios are plausible. In the first, the large number of distinct surface-adsorbed conformations could be separated by very low (less than or equal to  $k_B T$ ) potential energy barriers. This would result in a highly dynamic, disordered system where the adsorbed peptide conformations could readily interconvert at room temperature, producing a high degree of mobility of the surface-adsorbed peptides. The second scenario would correspond to the presence of high (much greater than  $k_B T$ ) potential energy barriers with respect to interconversion between the large number of distinct conformations. In this case, the peptide conformations would be frozen into a wide range of adsorbed structures, and would be essentially immobile on the surface, presumably from their first instance of contact on the Au nanoparticle surface. In the former scenario, a high  $S_{\text{conf}}$  value, corresponding to an excessive mobility of surface-adsorbed peptides, could be conducive to the thermally-activated exposure of patches on the Au nanoparticle surface. Our predicted averaged  $S_{\text{conf}}$  values, provided in Figure 7 (see Table S5 in the Supporting Information for the numerical values), indicate that the sequences Pd4-1, Pd4-2, Pd4-3, and Pd4-4, which correspond to unstable nanoparticle dispersions, all have very high  $S_{\text{conf}}$  values. This contrasts with Pd4 and Pd4-5, which have the lowest  $S_{\text{conf}}$  values in the set and also yield the only nanoparticle dispersions that remained stable after 24 h. These data suggest a connection between the  $S_{\text{conf}}$  value and nanoparticle stability in solution. However, because there is likely to be more than one mechanism that underpins nanoparticle stability, extension of this hypothesis to other peptide systems requires further investigation.

## CONCLUSION

In conclusion, we have presented a peptide synthetic mutation analysis that advances the understanding of the role of peptide sequence in controlling and modulating the affinity of the biomolecule for its target inorganic surface. In this regard, mutation of anchor points demonstrated that the local affinity can be modulated based upon the neighboring residues in the sequence, thus sequence context effects can influence the materials-binding ability of peptides. This observation was corroborated by both experimental and computational findings that pointed to important thermodynamic considerations for isolating the underlying basis of binding affinity. Further Au nanoparticle synthesis results demonstrated that the overall particle morphology was not directly associated with the  $\Delta G$  of binding to the material surface, suggesting that other biomolecular factors govern the size, shape, and stability of peptide-capped materials. A feature that is suggested to govern the stability of the peptide-capped nanoparticle dispersion was identified, namely the number of distinct conformations of the peptide in the surface-adsorbed state. Such results are important for the creation of rules for the *a priori* design of new biomolecules that can tune peptide affinity and specificity, as well as nanoparticle capping and stabilization ability for target inorganic structures. Such capabilities would be of significant use in the one-pot, aqueous synthetic design of functional materials, for applications wherein the ligand overlayer structure/morphology is critical to the intended functionality. For instance, controlling the bioligand surface display could be important for applications in biosensing, especially for Au nanorings<sup>43,44</sup> that are sensitive to the biomolecule orientation, and catalysis where selective peptide surface structures could be designed to enhance the particle functionality.



## **ASSOCIATED CONTENT.**

**Supporting Information.** Additional simulation methodology, Binding constants for the mutant peptides, Details of residue-surface contact analysis, Comparison of most populated clusters, Conformational entropy scores, Conditional binding probabilities, QCM analysis, size distribution histograms, Snapshots of simulation results for different protonation states. This material is available free of charge via the Internet at <http://pubs.acs.org>.

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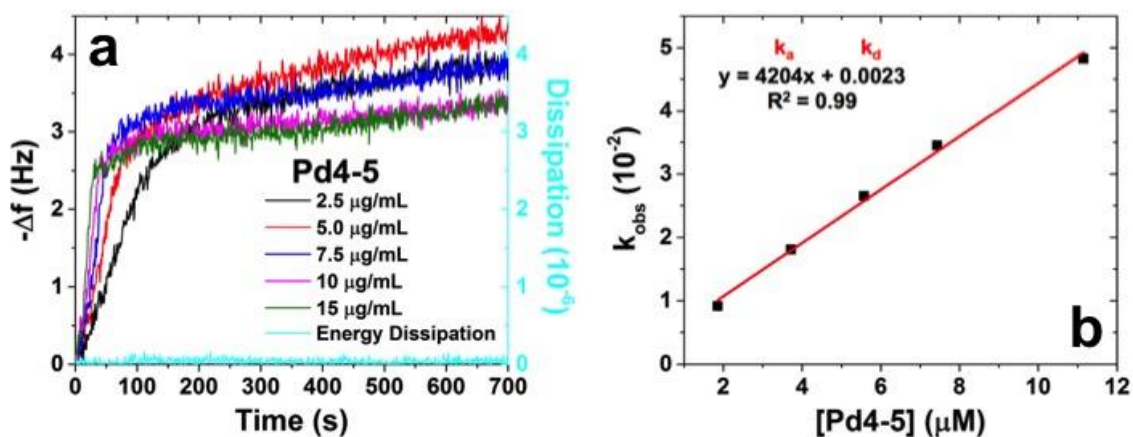
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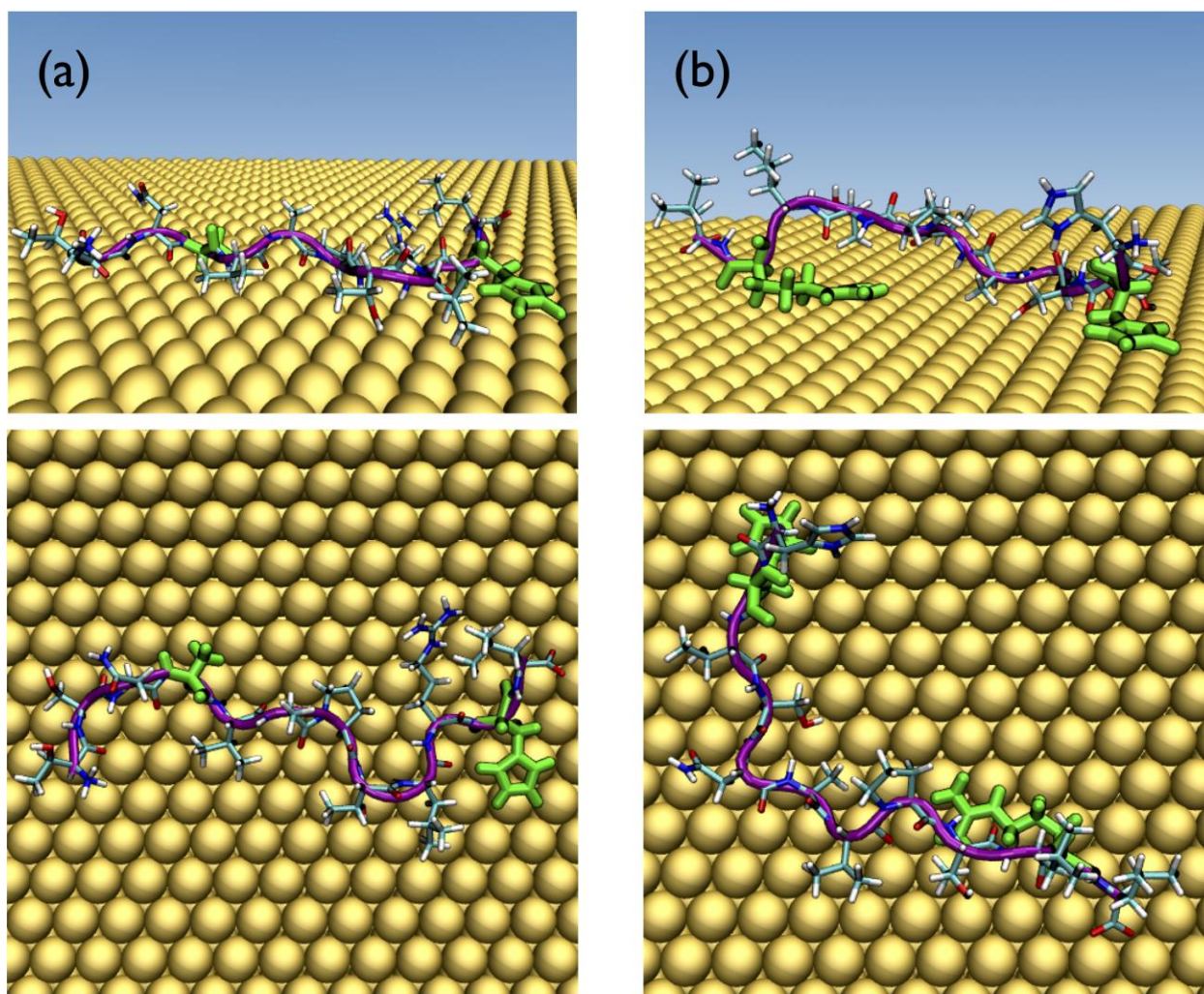
**Table 1. Adsorption Analysis for Parent Pd4 Peptide and Mutants on Au<sup>a</sup>**

Peptide	Sequence	$\Delta G$ (kJ mol <sup>-1</sup> )	$\theta$ (%)
Pd4	TSNAVHPTLRHL	-31.4 ± 0.1	79.8 ± 0.5
Pd4-1	TSNAVAPTLRHL	-27.2 ± 0.2	41.2 ± 1.6
Pd4-2	TSNAVHPTLRAL	-30.7 ± 0.1	75.0 ± 0.9
Pd4-3	TSNAVAPTLRAL	-32.0 ± 0.8	82.8 ± 5.0
Pd4-4	SPHTTNHRALLV	-33.1 ± 0.2	88.8 ± 0.8
Pd4-5	HHTSNAVPTLRL	-35.5 ± 0.2	95.3 ± 0.4

<sup>a</sup>From QCM experiments: adsorption free energies ( $\Delta G$ ) values, as well as surface coverage at the highest peptide concentration studied (15  $\mu\text{g/mL}$  peptide). Values are given as mean  $\pm$  one standard deviation from at least three independent experiments.

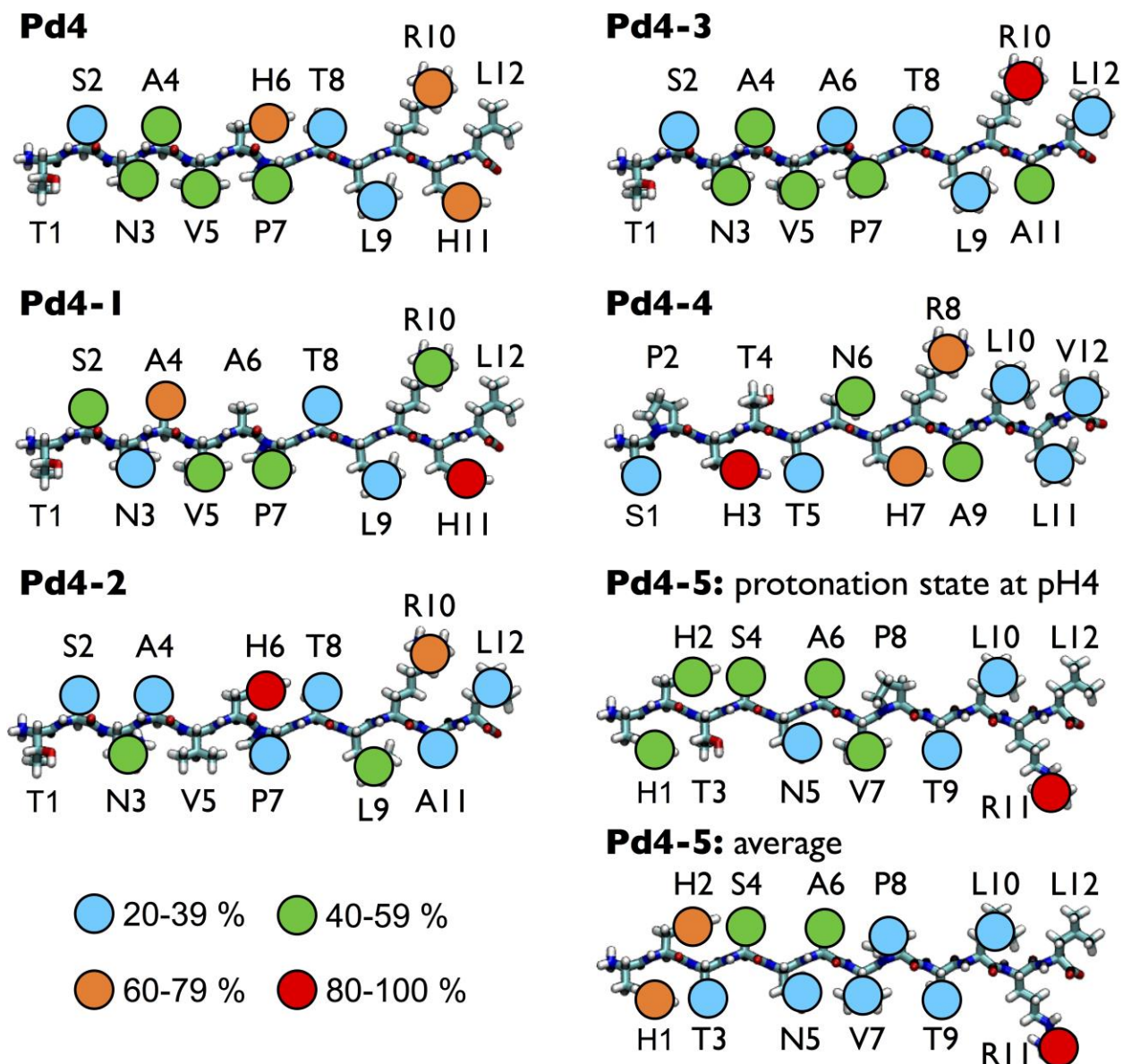


**Figure 1.** QCM analysis of the Pd4-5 peptide to obtain  $k_a$  and  $k_d$  values. Part (a) shows the inverted frequency change vs. time for five concentrations, as well as the dissipation energy plot for the highest concentration studied. Part (b) shows  $k_{\text{obs}}$  values vs. peptide concentration, obtained from the data in part (a) by fitting using Langmuir kinetics. Note that no error bars are presented as they are smaller than the points in the graph. The slope and  $y$ -intercept in part (b) provide the rate constants for adsorption and desorption, respectively.



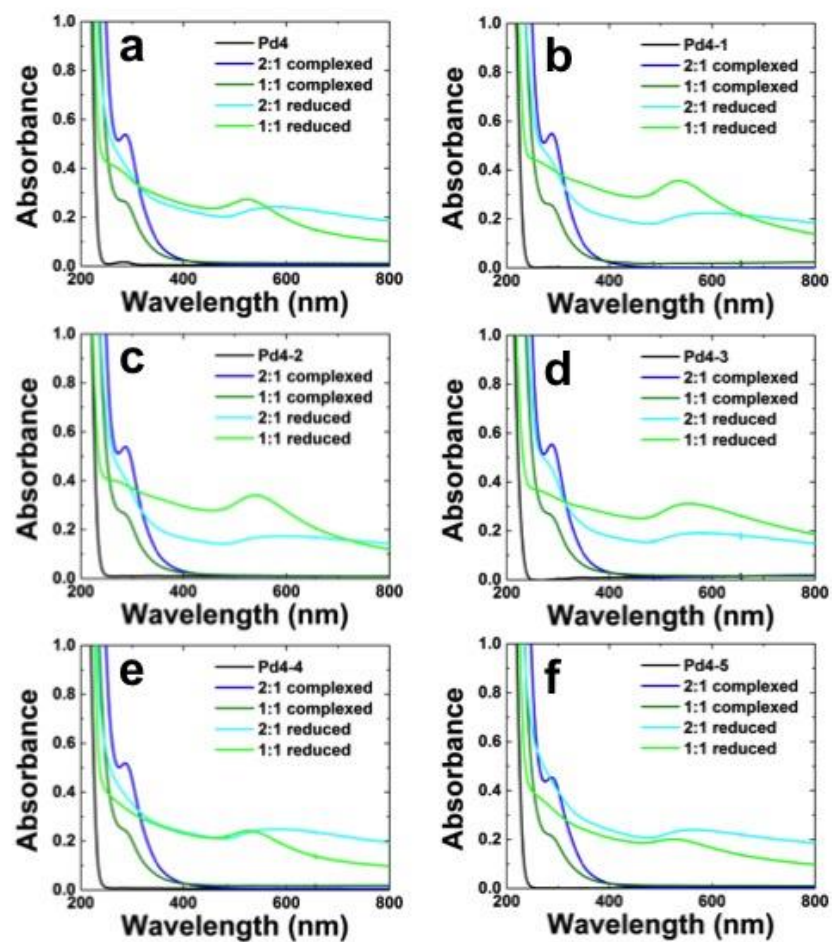
**Figure 2.** Representative snapshots of the peptides (a) Pd4-1 and (b) Pd4-5 adsorbed at the Au(111) interface, shown in side (top) and plan (bottom) views. The anchor residues are colored bright green, while the peptide backbone is colored purple. Water molecules are not shown for clarity.



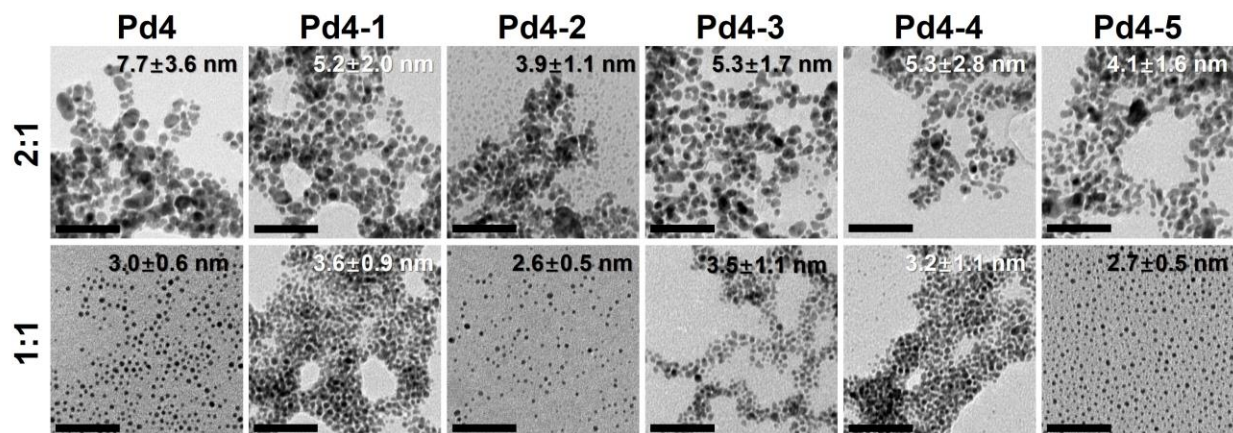


**Figure 3.** Degree of residue-surface contact for each of the six peptide molecules, adsorbed at the aqueous Au interface, predicted from the REST simulations. All data shown for peptides simulated at pH 4 and for the average over different protonation states for Pd4-5.

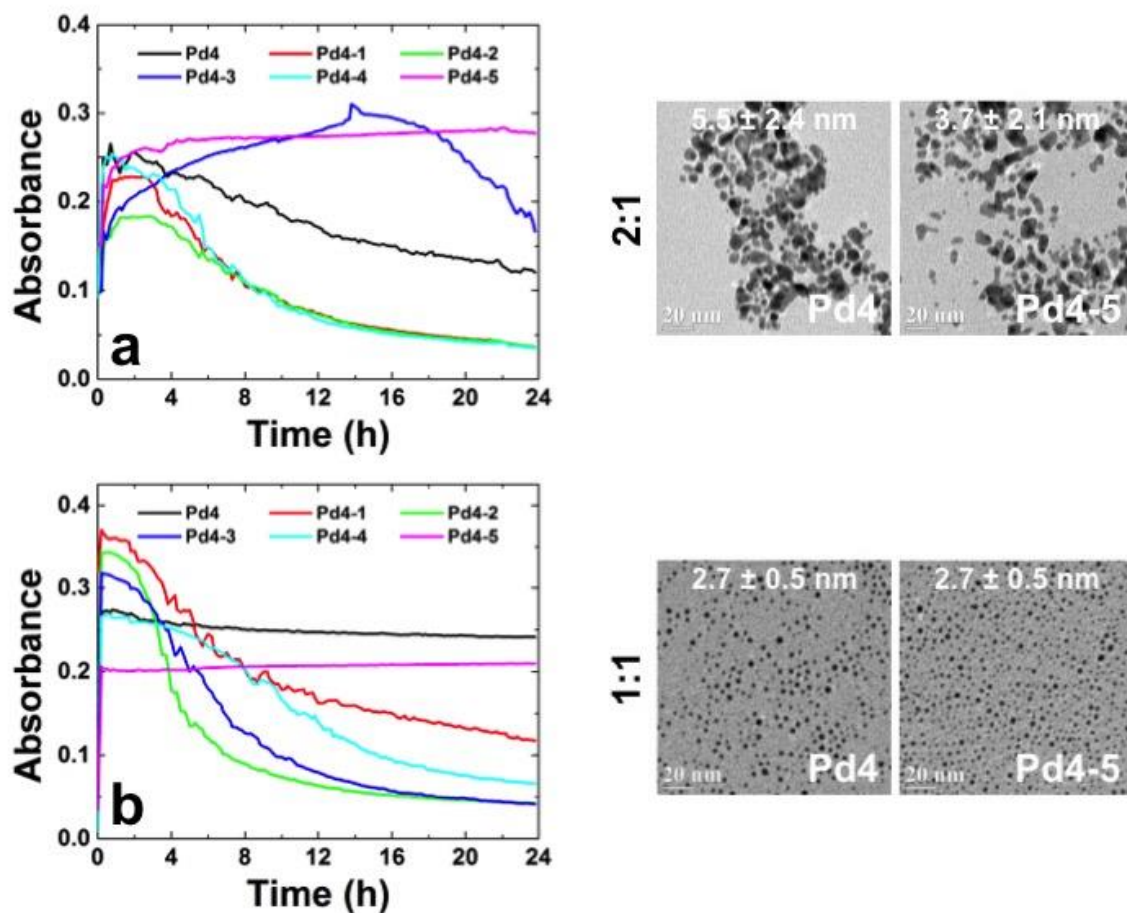




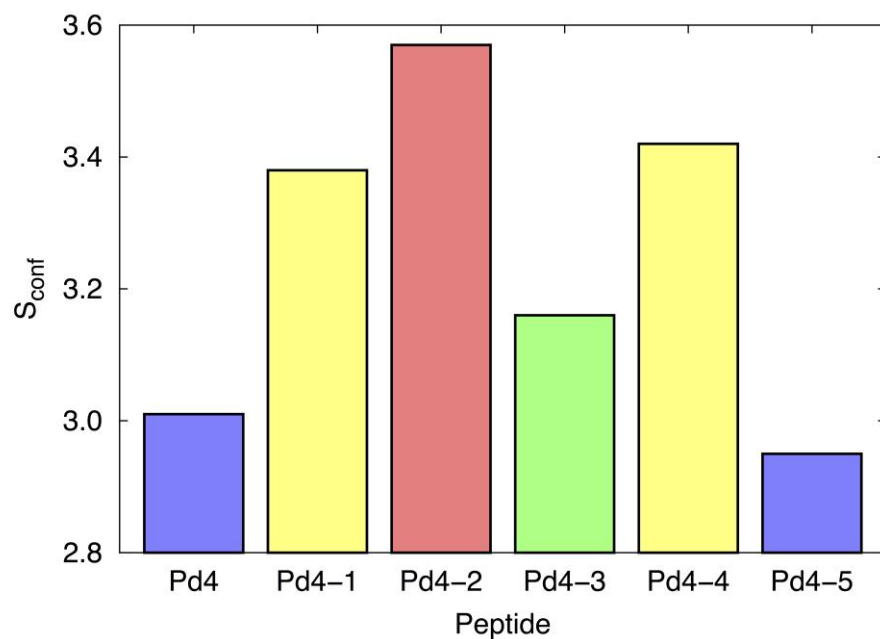
**Figure 4.** UV-vis analysis of Au nanoparticles capped with (a) Pd4, (b) Pd4-1, (c) Pd4-2, (d) Pd4-3, (e) Pd4-4, and (f) Pd4-5 peptide. Ratios represent molar ratio of Au:peptide.



**Figure 5.** TEM analysis of the Au nanoparticles capped with the indicated mutant peptides. TEM grids were prepared 1 h after reduction. The top row displays the materials fabricated at a Au:peptide ratio of 2, while the bottom row shows the structures generated at a ratio of 1. All scale bars are 50 nm.



**Figure 6.** UV-vis and TEM analysis for the stability of the Au nanoparticle dispersions 24 h after reduction. Part (a) presents the data for the materials prepared at a Au:peptide ratio of 2, while part (b) shows the data for the particles produced at a ratio of 1.



**Figure 7.** Values of the conformational contribution to the entropy of peptide-surface binding ( $S_{\text{conf}}$ ) for the parent Pd4 peptide and all variants on this sequence. Numerical values are provided in Table S5 of the Supporting Information.

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