Investigating Polyoxometalate–Protein Interactions at Chemically Distinct Binding Sites

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S Supporting Information

ABSTRACT: In this study, a combined molecular docking (rigid and flexible) and all-atom molecular dynamics simulations technique have been employed to investigate interactions of 1:1 Zr-containing Keggin polyoxometalate (ZrK) with four chemically distinct cleavage sites [Arg114–Leu115 (site 1), Ala257–Asp258 (site 2), Lys313–Asp314 (site 3), and Cys392–Glu393 (site 4)] of human serum albumin (HSA). The ZrK–HSA complexations were analyzed using electrostatic potentials, the chemical nature of amino acid residues, binding free energies, and secondary structures as parameters. They suggested that ZrK binds in a rather distinct manner to different cleavage sites, and its association was dominated by hydrogen bonding, both direct and solvent mediated, and electrostatic interactions, as suggested experimentally. The computed binding free interaction energies (−57.5, −24.2, −50.8, and −91.2 kJ/mol for sites 1, 2, 3, and 4, respectively) predicted the existence of one major binding site (site 4) and three minor binding sites (site 1, site 2, and site 3). The strong exothermicity of the binding was also supported by isothermal calorimetry experiments. Additionally, the binding of ZrK did not alter the overall α -helical secondary structure of HSA, which was in line with experimental observation. Furthermore, hydrolysis of the peptide bonds of the substrate was found to retain its overall structure. These results have provided a deeper understanding of the complex ZrK interactions with proteins, and they will lead to the design of the next generation of catalytically active polyoxometalates with improved hydrolytic activities.

I. INTRODUCTION

Polyoxometalates (POMs) are a versatile class of metal–oxygen clusters that utilize their molecular properties like charge, oxidation state, ligand environment, and photochemical characteristics in diverse fields such as catalysis, materials science, and analytical chemistry.^{1–12} Owing to their specificity toward different biomolecules, they also exhibit antiviral,¹³ antitumoral,¹⁴ antibacterial,¹⁵ and anticancer activities.¹⁶ Additionally, they have been used in ribosomal crystallography¹⁷ and for the inhibition of human immunodeficiency virus (HIV) reverse transcriptase¹⁸ and HIV protease activities.¹⁹ POMs have also been shown to inhibit amyloid β peptides (A β)²⁰ and basic fibroblast growth factor.²¹ Furthermore, as a hydrolytic agent, Zr(IV)-substituted POMs (Zr-POMs) have been reported to hydrolyze multiple peptide bonds of critical biomolecules including human serum albumin (HSA),^{1,22} hen egg-white lysozyme (HEWL),²³ myoglobin,^{1,24} b-insulin,²⁴ and cytochrome *c*.²⁵ The peptide bond is extremely stable, and its half-life is estimated to be between 350 and 600 years under physiological conditions.²⁶ However, the hydrolysis of this bond has been involved in a wide range of biotechnological, biomedical, and industrial applications like proteomics,²⁷ protein engineering,²⁸ protein footprinting,^{29–32} protein sequencing,^{33–35} bioethanol production,³⁶ and catalytic

drugs.^{37,38} Moreover, peptide bond cleaving enzymes constitute about 60% of all enzymes that are used in the textile, food, leather, paper, and ethanol production industries.³⁶ For hydrolytic activities, Zr-POMs are required to coordinate near-specific cleavage sites of their substrates such as HSA.²³ This Zr-POM-substrate association has been postulated to be driven by either electrostatic interaction of the negatively charged oxygen atoms of POM with the positively charged regions on the substrate surface or coordination of the oxophilic Zr(IV) ion to the amino acid side chains in the protein.^{39–44} The noncovalent interactions (NCI) in this process could occur both directly and indirectly through the mediation of solvent molecules.

HSA is one of the most abundant proteins in blood plasma with a concentration of 40 mg/mL.⁴⁵ It is considered as one of the major soluble constituents of the circulatory system and contributes significantly to colloid osmotic pressure and transport, distribution, and metabolism of ligands.^{46–48} Fatty acids, amino acids, metal ions, and various hydrophobic and acidic drugs are included in this ligand subset, which is 69

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Figure 1. Structures of (a) polyoxometalate (POM) and (b) human serum albumin (HSA).

70 responsible for numerous critical processes within the liver,
71 intestine, kidneys, and the brain.^{46–48} Owing to its biological
72 functions, HSA has been considered as one of the best studied
73 models to understand the physicochemical basis of drug–
74 protein interactions.⁴⁹

75 Recently, hydrolysis of HSA by a variety of POMs
76 $[(nBu_4N)_5\{W_5O_{18}Zr(\mu-OH)_2\}_2 \cdot 2H_2O$ (Zr2-L2),
77 $(Et_3NH_2)_{10}[Zr(PW_{11}O_{39})_2] \cdot 7H_2O$ (Zr1-K2), $(Et_3NH_2)_8[\alpha$ -
78 $PW_{11}O_{39}Zr(\mu-OH)(H_2O)]_2 \cdot 7H_2O$ (Zr2-K2), and $K_{15}H[Zr$ -
79 $(\alpha_2-P_2W_{17}O_{61})_2] \cdot 25H_2O$ (Zr1-WD2)] at pH 7.4 and 60 °C was
80 investigated.¹ The sodium dodecyl sulfate page data indicated
81 that peptide hydrolysis occurred in the same region of HSA in
82 the presence of each POM. After 48 h, less than 35% of HSA was
83 hydrolyzed by the Zr-containing Keggin POM (Zr1-K2).
84 However, after 192 h, the extent of hydrolysis was significantly
85 increased.¹ Because this reaction required the coordination of
86 the carbonyl oxygen of the peptide bond of the substrate to the
87 Zr(IV) ion, the dimeric 1:2 Keggin form (Zr1-K2) was unlikely
88 to be the reactive species in the absence of a vacant site on the
89 metal ion. The increased substrate concentration was previously
90 reported to influence the 1:2 POM speciation, shifting the
91 equilibrium toward the monomeric (1:1) species that was
92 capable of the aforementioned coordination.^{50,51} Additionally,
93 using Eu(III) luminescence spectroscopy, it was shown that in
94 the presence of HSA, the 1:2 (Zr1-K2) complex could convert
95 into the monomeric 1:1 (ZrK) species at physiological pH and
96 low POM concentrations (Figure 1a).⁵² Furthermore, mono-
97 meric ZrK was found to be bound to another biomolecule,
98 HEWL, in a cocrystal structure of the ZrK–HEWL complex.⁵³

99 From Western blot analysis and subsequent NH_2 -terminal
100 Edman degradation analysis, four distinct cleavage sites
101 (Arg114–Leu115, Ala257–Asp258, Lys313–Asp314, and
102 Cys392–Glu393) located in different regions of HSA were
103 identified (Figure 1b).¹ ZrK was quite versatile, and unlike most
104 natural proteases, in a rather nonpreferential manner, it cleaved a
105 variety of peptide bonds formed by chemically diverse amino
106 acid residues, that is, polar charged (Arg, Asp, and Glu) and
107 nonpolar (Leu, Ala, and Cys). Cleavage site 1 (Arg114–
108 Leu115) was located in the central cleft of HSA within a positive
109 inner surface. The width of the cleft was reported to be roughly 1
110 nm in size, which was quite comparable to the size of ZrK. Site 1,

as in all sites, was flanked by a positively charged surface patch,
which could facilitate interactions with the negatively charged
groups of ZrK.¹ The remaining cleavage sites Ala257–Asp258,
Lys313–Asp314, and Cys392–Glu393 of HSA occurred
upstream from negatively charged Asp or Glu residues,
suggesting that there could also be a possible electrostatic
interaction with the positively charged Zr(IV) or W ions of ZrK.
However, the hydrolysis requires coordination of the carbonyl
oxygen of the peptide bond to the Zr(IV) ion, and from
experiments, a weak ionic interaction rather than true
coordination was suggested.¹ Interestingly, it appears that
charge plays a larger role in the binding of Zr-POMs to HSA
as an increase in negative charge of the POM metal cluster
resulted in increased reactivity, whereas the addition of more of
Zr(IV) ions in its framework showed no apparent change.¹

In the absence of X-ray structures of the POM–HSA
complexes, the physicochemical nature of their interactions at
multiple cleavage sites is not known. The understanding of these
interactions at the atomistic level is required for utilization of
POMs in a variety of biochemical, biotechnological, and medical
applications. In this aspect, molecular dynamics (MD)
simulations can provide structural information and elucidate
the nature of POM–HSA interactions. Recently, this technique
was successfully utilized to explore the association of HEWL
with a variety of Ce(IV)-substituted POMs.⁴⁴ However, to the
best of our knowledge, interactions of a single POM with
multiple chemically distinct cleavage sites of a protein have thus
far not been investigated. Furthermore, changes in the secondary
structure of protein after the binding of POM and its hydrolysis
are not known.

In this study, we have employed all-atom MD simulations
using ZrK and HSA as models to address all of these unresolved
issues. The results are compared with the available experimental
data. Our simulations will provide structures of ZrK–HSA
complexes at all four chemically distinct cleavage sites and
elucidate their specificities. They will also help elucidate roles of
dynamics, specific amino acid residues, solvent, charge
distributions, secondary structures, and binding affinities in
POM–protein interactions. Furthermore, they will contribute
to design the next generation of POMs with enzymelike
activities.

II. COMPUTATIONAL PROCEDURE

The structures of ZrK and HSA were obtained from the Protein Data Bank (PDB ID: 4XYX and 4K2C, respectively).^{53,54} The X-ray structure of ZrK after including a hydroxyl nucleophile was fully optimized without any geometrical constraint employing density functional theory (DFT) functional B3LYP⁵⁵ and LanL2dz⁵⁶ (W and Zr) and 6-31G*⁵⁷ (O and H) basis sets as implemented in the Gaussian 09⁵⁸ program. The X-ray structure of HSA was relaxed in an explicit aqueous environment for 100 ns utilizing all-atom MD simulations. Molecular docking was performed using Autodock Vina 1.5.6 software⁵⁹ to obtain poses of binding of ZrK–HSA complexes around the four cleavage sites that were proposed experimentally.¹ Two molecular docking methods were utilized, rigid docking and flexible docking. The latter provided conformational flexibility to amino acid residues of HSA upon binding of ZrK. The size of the grid was chosen to cover these binding sites, and the spacing was kept to 1.00 Å. Each docking trial produced 20 poses with an exhaustiveness value equal to 20. The most promising poses provided by these docking procedures were subsequently used for MD simulations utilizing the GROMACS program^{60,61} and AMBER03⁶² force field. It is noteworthy that ZrK and POMs in general are very complex molecules to treat using molecular mechanics (MM). The RESP charges for ZrK were calculated and used to form a topology file using antechamber,^{63,64} an inbuilt tool in Amber.⁶⁵ The set of Lennard-Jones parameters for the W and O atoms of the ZrK framework was taken from previous works,^{66,67} whereas the parameters for Zr were taken from the UFF force field.⁶⁸ The ZrK metal cluster was treated as a semirigid body during the simulations where the oxygen and tungsten cage was held together using a matrix, a distance restrains with high energetic penalty (≥ 1000 kJ/mol), for conformational deviations. For all simulations, the starting structures were placed in a cubic box with dimensions of $100 \times 100 \times 100$ Å. This dismisses unwanted effects that may arise from the applied periodic boundary conditions. The box was filled with TIP3P⁶⁹ water molecules. Some water molecules were replaced by sodium and chloride ions to neutralize the system (overall charge = -18) and to simulate a physiological ion concentration of 154 mM. The starting structures were subsequently energy-minimized with a steepest descent method for 3000 steps of freezing binding site coordinates to minimize rearrangement. The results of these minimizations produced the starting structures for the MD simulations. The MD simulations were run for 100 ns each for all four sites. These simulations were performed using a constant number of particles (N), pressure (P), and temperature (T), that is, NPT ensemble. The SETTLE algorithm⁷⁰ was used to constrain the bond lengths and angles of the water molecules, whereas the LINCS algorithm⁷¹ was used to constrain the bond lengths of the peptide. The long-range electrostatic interactions were calculated by the Particle-Mesh Ewald method.⁷² A constant pressure of 1 bar was applied with a coupling constant of 1.0 ps; peptide, water molecules, and ions were coupled separately to a bath at 300 K with a coupling constant of 0.1 ps. The trajectories were computed for each model with a time step of 2 fs, and the data was saved every 500 steps. The ionizable amino acid residues were set to their normal ionization states at pH 7.0. The tools available in GROMACS were utilized to analyze the MD trajectories. We used the most representative structures for the structural elucidation. The most representative structures were derived from a cluster analysis, where the trajectories are analyzed by grouping structurally

similar frames [root-mean-square deviation (RMSD) cutoff of 0.30 nm], whereas the frame with the largest number of neighbors is denoted as a middle structure that represents that particular cluster. The computed RMSD values confirmed the equilibration of all structures within the simulation timeframe (Figure S1). Noncovalent interaction (NCI) plots were calculated using the NCIPLOT program.^{73,74} This program provides an index that is based on electron density and its derivatives that allows for the identification of noncovalent interactions. The binding free energies were calculated using a thermodynamic cycle that describes the bound and unbound states utilizing the lambda (λ) particle approach. Using a thermodynamic cycle, the relative binding energies of two ligands can be described by the difference in free energy associated with the chemical change of one ligand into the other in the bound and solvated environments.⁷⁵ This approach has been described in detail in previous works.^{75–77} In these calculations, van der Waals and Coulombic interactions between ZrK and HSA were turned off in a systematic way; first, Coulombic terms were diminished, followed by the van der Waals terms. This allowed no oppositely charged atoms to interact at very close distances, which would have resulted in unstable configurations and unreliable energies. The efficient leap-frog stochastic dynamics integrator was used along with the neighbor searching cutoff scheme Verlet with a frequency value of 20.^{78–80} Standard compressibility and Parrinello–Rahman⁸¹ pressure coupling was used, which is an extended-ensemble coupling, where the box vectors are subject to equations of motion every 1.0 ps. The value of the α scaling factor used for the soft-core Lennard-Jones equations was set to 0.5 with a power of 1.0 associated with λ . The σ value, assigned to any atom that has C6 and C12 parameters that equal zero, was 0.3, which is typical for the treatment of hydrogen atoms. Secondary structure diagrams were generated for all complexes studied from production runs utilizing the inbuilt tools mdmat and DSSP^{82,83} within the GROMACS package. Electrostatic surface potentials for HSA were calculated using Adaptive Poisson-Boltzmann Solver⁸⁴ software and visualized with PyMol.⁸⁵ YASARA^{86,87} and Chimera⁸⁸ programs were used for visualization and for the preparation of the structural diagrams presented in this study. ONIOM calculations were performed to probe the possibility of negatively charged residues interacting with the positive character originating from the W metals of ZrK. In these calculations, the system was divided into two parts, a selected model system [ZrK (POM), Aps13, and Asp255] that was treated with quantum mechanics (QM), whereas the remaining part of HSA was treated with molecular mechanics. The ONIOM optimization procedure used macro-/micro-iterations,⁸⁹ and the electrostatic interactions between the QM and MM regions were treated by mechanical embedding. The geometry was optimized without any symmetrical constraints at the B3LYP/LanL2dz level of theory^{55,90} [with the corresponding Hay–Wadt effective core potential for Zr and W⁹¹], and the 6-31G(d) basis set was used for all of the other atoms in the QM layer. The MM part was treated using the AMBER force field.^{92,93}

III. RESULTS AND DISCUSSION

In this study, interactions of ZrK with four chemically distinct cleavage sites that are located in different parts of the HSA have been explored using all-atom MD simulations. The structures of all ZrK–HSA complexes and their interactions have been discussed using electrostatic potentials, chemical nature of

Figure 2. Most representative structures of POM–HSA at site 1 obtained from molecular dynamics simulations: (a) whole protein with cleavage site 1 highlighted with N- and C-terminal ends colored blue and red, respectively; (b) electrostatic map of HSA; (c, d) zoomed-in images of binding site 1 with amino acid residues and interaction distances labeled in Å; and (e, f) water-mediated interactions with the oxygen of ZrK, with the hydrogen bonding interacting distances labeled in Å. In the POM structure, the orange polyhedron represents the interior phosphate group, the dark blue polyhedron represents the octahedron geometry around the tungsten, and the light blue represents the Zr(IV) species.

274 individual amino acid residues, binding free energies, and
275 secondary structures as parameters.

III.I. ZrK–HSA Interactions at Site 1 (Arg114–Leu115). 276
The first cleavage site (Arg114–Leu115, site 1) was formed by a 277

Figure 3. Noncovalent interaction (NCI) plots and hydrogen bonding interactions at all four sites.

positively charged (Arg) and a nonpolar (Leu) residue. This site was a part of a random coil section on the surface of HSA that showed little to no secondary structure (Figure 2a). The electrostatic potential map (Figure 2b) suggested two positively charged regions on either side of the peptide bond. Thus, both rigid and flexible docking of ZrK around this site provided two

possible binding motifs. The first motif included two positive residues Arg114 and Lys137 of HSA that were present on the exterior surface of the cleavage site. The stability of this site was tested through MD simulations. There were no ZrK–HSA interactions at this site throughout the MD trajectory, and the overall nonbonding energies were very small. However, during

the simulation, ZrK moved down to a more hydrophobic cleft formed by the Val120–Lys137 region. The second binding motif from the docking procedure was found on the opposite side of site 1. It was located on the interior of the cleavage site, where a large pocket surrounded by many positively charged residues allowed for binding of a negatively charged ZrK. This site, termed FA1, has previously been identified to bind long-chain fatty acids.⁹⁴ Given the flexible nature of random coil sections, this site was easily accessible for the binding of ZrK. The size of this site was roughly 1.0 nm and could easily accommodate Keggin-type POMs (length ≤ 1.0 nm); however, larger POMs such as Wells–Dawson (length ≥ 1.2 nm) would not be accommodated as easily. Furthermore, this site was buried within the protein, which could further limit larger POMs from entering the binding site. However, the first binding motif suggested by the docking procedure was located on the surface of HSA (roughly 2.0 nm in length), which could easily accommodate the larger Wells–Dawson POMs.

The FA1 site was stabilized by a host of hydrogen bonds from positively charged amino acid residues of HSA. These types of interactions have been previously proposed to drive the association of POMs with biomolecules.^{95–97} For instance, Arg117, Arg186, and Arg428 formed multiple hydrogen bonds through interactions between their amine protons and the negatively charged oxygen cage of ZrK (Figure 2c). Additionally, positively charged Lys190 and Lys519 residues associated through hydrogen bonding with the surface of ZrK (Figure 2c,d). The negatively charged surface of ZrK preferred positive patches along the protein surface and readily bound to these sections even in the presence of negatively charged residues (Asp/Glu). These residues should in theory repel the ZrK from binding; however, here this repulsion was overcome by the greater attractive hydrogen bonding and electrostatic interactions originating from positively charged residues (Figure S4). The geometrical constraints imposed by these stronger interactions hold the negatively charged residues in their place. The negatively charged residues such as Asp and Glu (particularly Glu520) did show minor interactions with the positive charge of the W metals of the cage, but they were very weak and low in number (Table S1). This small interaction energy with the metals (W or Zr) was largely overshadowed by the repulsion generated as the carboxylic side chain moved closer to the oxygen cage of ZrK (Figures 2d and S4). However, an Asp/Glu residue is required in the vicinity of the Zr metal center due to its role as a Bronsted base in the acid/base chemistry utilized by POMs for peptide hydrolysis.⁹⁸ The NCI contour plots that show relative abundance and strength of the noncovalent interactions also highlighted Lys519, Arg428, Lys190, and Arg186 as the main interacting residues at this site (Figure 3a). They reveal a set of complex ZrK–HSA interactions that arise from a combination of specific atom–atom interactions, including hydrogen bonding and electrostatic interactions. Furthermore, ZrK was found to form an average of seven direct hydrogen bonds with HSA (Figure 3a). Additionally, there were multiple hydrogen bonding interactions mediated by one to three solvent water molecules. The key interactions promoted by one water molecule are shown in Figure 2e,f. In particular, the backbone of Leu115 and the side chain of Arg145 associated with ZrK through one water molecule (Figure 2e). The side chains of Arg428 and Lys432 also exhibited similar interactions (Figure 2f). The catalytically important Zr–OH moiety was positioned on the interior of the protein close to this cleavage site; however, it was still exposed to

water through the bottom channel opening. It was in the direct vicinity of a positively charged Lys190 residue. The binding free energy of this site was -57.5 kJ/mol (Table 1). The binding of

Table 1. Free Energy Change of the Complexation of the Ligand and Receptor (kJ/mol)

position	hydrogen bonds	$\Delta G_{\text{binding}}$
site 1	7	-57.5 ± 11.7
site 2	3	-24.2 ± 11.9
site 3	3	-50.8 ± 11.3
site 4	8	-91.2 ± 10.8

HSA to another Keggin-type POM [H2W12] was also shown to be exothermic ($\Delta H = -50$ kJ/mol) by isothermal calorimetry (ITC) experiments.⁴⁰ The strong exothermicity of this process also suggests that these interactions are dominated by hydrogen bonding and electrostatic interactions.⁴⁰ The binding of ZrK to HSA at site 1 was not observed to alter its secondary structure, which was dominated by α -helical conformation (67%), (Table 2). Additionally, this interaction had no effect on the overall

Table 2. Secondary Structure (%) of Human Serum Albumin (HSA) and POMs Bound to HSA at Sites 1–4

position	coil	bend	turn	A-helix	3-helix
HSA	13	8	9	68	2
site 1	13	6	9	67	5
site 2	13	6	9	69	3
site 3	13	7	10	66	4
site 4	13	6	10	66	5

structure of HSA, and the RMSD with the ZrK-free structure was only 1.16 Å (Figure S2). The binding of H2W12 POM also did not change the secondary structure of the HSA.⁹⁹ Furthermore, the overall secondary structure of HSA was found to be quite stable and did not alter upon the hydrolysis of site 1 in both the presence and absence of ZrK (Figure S3).

III.II. ZrK–HSA Interactions at Site 2 (Ala257–Asp258).

The second cleavage site (Ala257–Asp258, site 2) was formed by a nonpolar (Ala) and a negatively charged (Asp) residue. This site was located 34.5 Å away from site 1. It was sandwiched between two parts of a well-folded section of HSA in which α helical secondary structure dominated (Figure 4a). Furthermore, this site was flanked by a large positively charged region that could offer stability for the binding of ZrK to the HSA surface (Figure 4b). In contrast to site 1, it was located on the surface of the protein, where large electropositive regions could accommodate the binding of both small and large POMs with a distinct charge, size, and shape. Positive amino acid residues stabilize this site through hydrogen bonding interactions (Figure S5). Unlike site 1, the docking procedure (both rigid and flexible) around this site provided only one binding motif that was used as the starting point in the subsequent MD simulations. The most representative structure derived from MD simulations is shown in Figure 4c,d. The positively charged Arg10 associated with ZrK through two weak hydrogen bonds (Figure 4c,d). Additionally, the α -amino group of Lys262 formed two hydrogen bonds with the oxygen atoms of ZrK at distances of 2.18 and 2.71 Å. NCI contour plots also showed moderate electrostatic interactions originating from the Arg10 and Lys262 residues (Figure 3b). In comparison to site 1, at this site ZrK formed a much smaller number of direct hydrogen bonds, on

Figure 4. Most representative structure of POM–HSA at site 2 obtained from molecular dynamics simulations: (a) whole protein with cleavage site 2 highlighted with N- and C-terminal ends colored blue and red, respectively; (b) electrostatic map of HSA; (c, d) zoomed-in images of binding site 2 with amino acid residues and interaction distances labeled in Å; and (e, f) water-mediated interactions with the oxygen of ZrK, with the hydrogen bonding interacting distances labeled in Å. In the POM structure, the orange polyhedron represents the interior phosphate group, the dark blue polyhedron represents the octahedron geometry around the tungsten, and the light blue represents the Zr(IV) species.

average 3, with HSA (Figure 3b). Among water-mediated hydrogen bonds, the side chains of Lys240 and Lys262 interacted through one water molecule (Figure 4e). On the contrary, both side chain and backbone of Asp13 formed

hydrogen bonds with the cage of ZrK (Figure 4f). Here, negatively charged Asp13 and Asp255 residues were also found to directly interact with the W atom of ZrK (Table S1). These, rather surprising, interactions were further investigated using

Figure 5. Most representative structure of POM-HSA at site 3 obtained from molecular dynamics simulations: (a) whole protein with cleavage site 3 highlighted with N- and C-terminal ends colored blue and red, respectively; (b) electrostatic map of HSA; (c, d) zoomed-in images of binding site 3 with amino acid residues and interaction distances labeled in Å; and (e, f) water-mediated interactions with the oxygen of ZrK, with the hydrogen bonding interacting distances labeled in Å. In the POM structure, the orange polyhedron represents the interior phosphate group, the dark blue polyhedron represents the octahedron geometry around the tungsten, and the light blue represents the Zr(IV) species.

hybrid quantum mechanics/molecular mechanics (QM/MM) ONIOM calculation. In the starting structure of this calculation, the interactions of W with Asp13 and Asp255 were broken by flipping them out of the binding pocket (≥ 3.8 Å). However, during the optimization, both these residues changed their

orientations and coordinated to the W metal as observed in the MD equilibrated structure. These interactions induced slight modification to the geometry of the W metal center that changed from octahedron to distorted pentagonal bipyramidal conformation.

Figure 6. Most representative structure of POM–HSA at site 4 obtained from molecular dynamics simulations: (a) whole protein with cleavage site 4 highlighted with N- and C-terminal ends colored blue and red, respectively; (b) electrostatic map of HSA; (c, d) zoomed-in images of binding site 4 with amino acid residues and interaction distances labeled in Å; and (e, f) water-mediated interactions with the oxygen of ZrK, with the hydrogen bonding interacting distances labeled in Å. In the POM structure, the orange polyhedron represents the interior phosphate group, the dark blue polyhedron represents the octahedron geometry around the tungsten, and the light blue represents the Zr(IV) species.

Unlike site 1, here the Zr-OH moiety was flipped out and exposed to the solvent positioned perpendicular to the cleavage site. As a result of these weak and fewer interactions, the binding free energy (24.2 kJ/mol; Table 1) for this site was substantially higher than the one (57.5 kJ/mol) computed for site 1. The association of POM with this site slightly (1%) increased the α -helical content (69%) of HSA in comparison to site 1, but the overall secondary structure remained the same (Table 2). The binding of ZrK at this site and its hydrolysis did not modify the overall structure of HSA, and RMSD remained 1.15 Å in both cases. Because binding of ZrK to sites 1 and 2 and their hydrolysis did not change the structure of HSA, those possibilities were not explored for the remaining two sites.

III.III. ZrK–HSA Interactions at Site 3 (Lys313–Asp314). The third cleavage site (Lys313–Asp314, site 3) was created by a positively charged (Lys) and a negatively charged (Asp) residue. This site was located 61.4 Å apart from site 1 and positioned on the edge of HSA (Figure 5a). It contains a small positively charged patch surrounded by a predominantly negative region (Figure 5b). Because this site possesses the smallest positively charged region, the binding of larger POM structures, except ZrK, at this location would be quite difficult. As expected, among all four cleavage sites, this site was the most challenging to obtain the ZrK–HSA complex. That was in part due to its location at the very edge of HSA with not much in the way of amino acids to stabilize this site. The lack of secondary

structure within this site could also account for the loss in stabilization. Unlike for the previous two sites, for which rigid docking multiple binding motifs were observed, here mainly binding to the side of HSA near the cleavage site was detected. However, these binding sites positioned ZrK far (≥ 10 Å) from the peptide bond cleavage site and were discarded. However, flexible docking that allowed Lys313 and Lys317 to adjust their conformations provided a more stable binding site on the very edge of HSA. In this pose, ZrK was positioned much closer to the cleavage site. The MD simulations showed that at this site, ZrK was trapped between two positively charged residues, Lys313 and Lys317 (Figure 5c,d). Both these residues formed multiple hydrogen bonding interactions with ZrK. In particular, the amine side chains of Lys313 and Lys317 residues associated through contacts with the oxygen cage of ZrK (Figure S6). Additionally, ZrK interacted directly with the residues forming the scissile peptide bond, which was not observed for any other site. The NCI plots also showed Lys313 and Lys317 as the main interacting residues, and similar to site 2, ZrK formed three direct hydrogen bonds on average with HSA (Figure 3c). Additionally, some solvent water-mediated interactions were observed for this site. For instance, side chains of Lys313 and Asp314 associated with ZrK through one water molecule each that form a single hydrogen bond with oxygen atoms of the metal cluster (Figure 5e). On the contrary, the side chain of Lys317 formed a hydrogen bond with a water molecule that in turn interacted through two hydrogen bonds with ZrK (Figure 5f). Similar to site 2, the Zr-OH moiety in this site was oriented toward the solvent, that is, on the opposite site of the substrate. The binding free energy of -50.8 kJ/mol for this site is comparable to site 1 but much lower than the binding energy for site 2 (Table 1). The ZrK-POM association at this site is facilitated by a smaller number but somewhat stronger interactions in comparison to site 1. In comparison to the previous sites, the association of ZrK to this site slightly (1%) decreased the α -helical content (66%) by 1 and 3%, respectively, without affecting the overall structure of HSA (Table 2).

III.IV. ZrK-HSA Interactions at Site 4 (Cys392-Glu393). The last site (Cys392-Glu393, site 4) was created by a nonpolar (Cys) and a negatively charged (Glu) residue. This site was positioned 33.9 Å away from site 1 on the backside of HSA. It was stabilized by α helical secondary structure and a cysteine bridge (Figure 6a). This binding pocket was surrounded by a very large positively charged region located next to the cleavage site (Figure 6b). Similar to site 2, this site was situated on the surface of HSA. Because it possessed the largest positive region among all four sites, it could easily accommodate different types of POMs irrespective of their charge, size, and shape. From both rigid and flexible docking, two binding motifs were observed, with the first being close to the site of cleavage; however, it was primarily stabilized by a glutamine residue. The second binding motif was located on the opposite side of the cleavage site; however, it was stabilized by a host of hydrogen bonds originating from positively charged residues such as Lys and Arg. Owing to greater electrostatic interaction and stabilization, the second binding motif was found to dominate and was used for the subsequent MD simulations. The binding pocket was formed primarily from Arg410, Lys413, Lys414, and Lys541; all held strong hydrogen bonding interactions with the negatively charged oxygen cage of ZrK (Figure 6c,d). Interestingly, this was the largest positive patch calculated for HSA, as shown by the electrostatic maps. This large positively charged region could make this site more

accessible to ZrK, and this was observed during the simulations. Additionally, this site has been identified as the major binding site for a variety of drug molecules such as ibuprofen^{100,101} and diazepam^{101,102} and has been labeled Sudlow's drug site II.^{103,104} Like site 1, ZrK was held between many positive residues Arg410, Lys413, Lys414, and Lys541 of HSA at distances of 2.20, 2.26, 2.48, and 2.42 Å, respectively (Figure 6c,d). Additionally, these residues interacted through multiple hydrogen bonds with the cage of ZrK, for example, Lys414 shows hydrogen bonding interaction with three separate contacts with the oxygen cage of ZrK (Figure S7). However, the interaction distances were shorter in comparison to the other sites 2 and 3, where hydrogen bonding was weaker and less in number. This site is the most comparable to site 1, where it was surrounded by positively charged residues; however, site 4 is more exposed to the solvent, whereas site 1 was more buried within the protein. Unlike the other three sites, a water molecule was found to be very close to Zr in this site. At this location, it can directly bind to the metal ion and change its coordination number, as shown by previous DFT and Car-Parrinello MD simulations.^{105,106} Additionally, Glu492 formed a very weak electrostatic interaction with a W metal of ZrK at a distance of 2.92 Å (Figure 6c and Table S1). However, this weak interaction was dominated by the repulsion between the carboxylic side chain of Glu492 and the oxygen framework of ZrK (Figure S7 in the Supporting Information). Therefore, as in all sites, there was a competition between the attractive and repulsive forces generated by positively (Lys and Arg) and negatively (Asp and Glu) charged residues, respectively. At this site, ZrK formed the highest number of direct hydrogen bonds, eight on average, with HSA and showed strong interactions with Lys541, Lys413, Lys414, and Arg410 (Figure 3d). Like in the first three sites, hydrogen bonding interaction involving one water molecule was observed. For instance, side chains of Gln390, Asn386, and Ser489 interact with ZrK through one water molecules (Figure 6e). Ser489 associates with this complex through unusual hydrogen bonding. The carboxyl group of this residue utilizes one water molecule to interact with ZrK (Figure 6e). Furthermore, Lys413 and Val493 interact with the oxygen framework of ZrK through one and two water molecules, respectively (Figure 6f). This site possessed the highest binding free energy (-91.2 kJ/mol; Table 1) among all four binding sites. Similar to site 1, in contrast to sites 2 and 3, the Zr-OH group here was opposite the surface of the protein and was shifted toward the cleavage site. Rather surprisingly, the α -helical content (66%) of this site is exactly the same as of site 3 (Table 2).

IV. SUMMARY AND CONCLUSIONS

In this study, we have employed molecular docking and all-atom MD simulation techniques to study interactions of 1:1 Zr-containing Keggin POM (ZrK) with four cleavage sites of HSA. These chemically diverse sites (Arg114-Leu115, Ala257-Asp258, Lys313-Asp314, and Cys392-Glu393) were located in different parts of HSA (Figure 1). They were found to bind in a rather distinct manner to form the ZrK-HSA complexes. These complexes were dominated by hydrogen bonding interactions from the oxo group containing the framework of ZrK and positively charged amino acid residues of HSA. The computed binding free energies (-57.5 , -24.2 , -50.8 , and -91.2 kJ/mol for sites 1, 2, 3, and 4, respectively) suggested that there is one major binding site (site 4), two intermediate sites (site 1 and site 3), and one minor binding site (site 2); see Table

1. Site 4 has been known to bind several drug molecules as well. The high exothermicity of this process was in agreement with the measured value ($\Delta H = -50$ kJ/mol) for the POM [H2W12]–HSA interaction.⁴⁰ It is suggested to be driven mostly by electrostatic interactions.⁴⁰ At site 4, the ZrK–HSA complex formed eight direct hydrogen bonds on average, whereas two to three direct hydrogen bonds were observed for sites 2 and 3. These hydrogen bonds were contributed by positively charged Lys and Arg residues. Additionally, there were multiple hydrogen bonding interactions mediated by one to three solvent water molecules. The binding of ZrK to HSA did not modify the secondary structure of HSA, which was primarily dominated by α -helical conformation (67%); see Table 2. Furthermore, as suggested experimentally, the binding of ZrK and hydrolysis at sites 1 and 2 did not alter the overall structure of HSA.⁹⁹ POMs, in general, have been reported to interact with diverse biomolecules through hydrogen bonding albeit with varying strengths, extents, and types. Our study is complementary to experimental binding studies between POMs and proteins that are typically performed with ITC or Trp fluorescence spectroscopy; however, it offers an additional advantage as it allows detailed molecular and thermodynamic understanding of each binding site separately. Therefore, these results can be also applicable to understand the interaction of other POMs with a variety of different proteins.

ASSOCIATED CONTENT

Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acs.jpcb.8b02931.

RMSD of HSA and ZrK from molecular dynamics trajectories plotted verse time (Figure S1); superposition of ZrK bound and unbound states with HSA in text notation with RMSD listed (Figure S2); superposition of ZrK bound and unbound states with HSA in graphical representation (Figure S3); negatively charge residues interacting with HSA (Table S1) (PDF)

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