1	Molecular Dynamics Simulation of Model Asphaltenes between Surfaces of
2	Varying Polarity
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7	Abstract
8	The molecular interaction behaviors of a model asphaltene, N-(1-Hexylheptyl)-N'-(5-
9	carboxylicpentyl) perylene-3,4,9,10-tetracarboxylic bisimide (C5Pe), between two solid surfaces
10	of varying polarity, were studied by molecular dynamics simulations. The C5Pe molecules were
11	solvated in water, toluene, or heptane, and the two substrate surfaces are hydrophilic alumina and
12	relatively more hydrophobic siloxane surfaces (as model surfaces of two basal planes of kaolinite).
13	Distinct adsorption behaviors were revealed by the simulations, which were driven and caused by
14	the interaction of C5Pe molecules and surfaces of varying polarity in solvents of different nature.
15	In water, both C5Pe monomer and aggregates adsorbed on the alumina surface, instead of the
16	siloxane surface or staying in the liquid medium. Interestingly, in the control systems where a
17	C5Pe molecule was placed between two identical surfaces in water, it displayed weaker adsorption
18	when placed between two alumina surfaces than between two siloxane surfaces. Potential of mean
19	force (PMF) calculations demonstrated the interplay between enthalpy-driven adsorption on the
20	alumina surface and entropy-driven adsorption on the siloxane surface in water. In the adsorbed
21	C5Pe aggregates on the alumina surface, the hydrophobic parts of the molecules stacked in a
22	parallel manner and aligned perpendicularly to the alumina surface, while the hydrophilic parts
23	formed hydrogen bonds with the surface. In toluene, C5Pe adsorbed on the alumina surface, driven

24 by van der Waals and Coulomb interactions, as well as hydrogen bonding. A multi-layered C5Pe 25 aggregate on the alumina surface in toluene was observed, which resulted from coordination bonds established through Ca²⁺ between C5Pe molecules. In heptane, adsorption was found on both 26 27 alumina and siloxane surfaces, and PMF calculations showed similar strength of binding to the 28 two surfaces. The adsorbed aggregates were compact, with intermolecular π - π stackings that were 29 parallel to the surfaces. This work provides a mechanistic understanding of the interaction 30 behaviors of asphaltenes in solution media when different clay surfaces are simultaneously present, 31 how such behaviors may be influenced by the nature of the solvent, and the molecular forces 32 driving such behaviors.

33 Keywords: asphaltene; adsorption; kaolinite; varying polarity; aggregation

34 **1. Introduction**

35 Polyaromatic compounds consisting of fused aromatic rings and side chains usually possess 36 remarkable surface-active properties, arising from the distinctive physical and chemical properties 37 of the fused rings and the side chains. The interfacial behaviors of polyaromatic compounds at 38 solid-liquid interfaces are of great interest in many research fields such as supramolecular 39 assembly [1], waste removal [2], and fabrication of organic electronic devices [3]. Asphaltenes are 40 polyaromatic compounds that originate from crude oil, defined by their solubility: insoluble in 41 alkanes and soluble in toluene [4]. The molecular structures of asphaltene are complex but 42 generally demonstrated to contain polycyclic aromatic hydrocarbons (PAHs) and aliphatic chains 43 [5–8]. The deposition of asphaltene on solid-liquid interfaces was widely reported in the petroleum 44 industry, causing severe problems such as reducing the reservoir permeability [9] and clogging the 45 production devices [10], thus highlighting the importance of studying their interfacial behaviors. 46 The adsorption of asphaltene and asphaltene-like polyaromatic compounds on solid-liquid

interfaces has been shown in many previous works to be principally regulated by the property of

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48 the solid surface. Shi et al. [11] probed the interactions between oil (toluene) droplets containing 49 asphaltenes and different solid surfaces using atomic force microscopy (AFM) in saline water. The attachment of an oil droplet on a hydrophilic mica surface was measured to be inhibited by 50 51 sufficient addition of asphaltenes, which was attributed to the formation of an asphaltene film on 52 the surface of oil droplet that protected the droplet from attaching to the hydrophilic surface 53 through steric interactions [11–18]. Contrastingly, the force curves between an oil droplet and a 54 hydrophobized mica surface were similar with and without the addition of asphaltenes. The 55 migration of asphaltenes to the surface of the oil droplet did not alter the hydrophobic interaction 56 between the oil droplet and solid surface [11]. Using quartz crystal microbalance with dissipation 57 (QCM-D) and AFM, Liu et al. [19] measured the amount and strength of adsorption of a neutral 58 model asphaltene, N-(1-Hexylheptyl)-N'-(5-carboxylicpentyl) perylene-3,4,9,10-tetracarboxylic 59 bisimide (C5Pe), from ethanol onto different synthesized solid surfaces. Sensors coated with silica 60 were used as hydrophilic surfaces, which were immersed into octade-cyltrichlorosilane solution to 61 obtain hydrophobic surfaces. The experimental results showed that the adsorption was preferred 62 on the hydrophilic surface as compared to the hydrophobic one. Molecular dynamics (MD) 63 simulation was also performed and showed that in ethanol the adsorption on the hydrophilic 64 surface was driven by the hydrogen bonding (H-bonding) between the polar groups of C5Pe and 65 the hydroxyl groups of the surface. In comparison, the adsorption on the hydrophobic surface was 66 driven by van der Waals interaction.

Besides the solid surface, solvent also demonstrated the ability to mediate the adsorption of asphaltene and similar compounds. Using AFM, the interactions between a pristine silica probe and a bitumen-coated silica in cyclohexane and heptane were measured by Liu et al. [18]. The silica-bitumen interaction remained repulsive in cyclohexane, a good solvent for bitumen 71 components (e.g., asphaltene). The repulsion resulted from the steric force caused by the swollen 72 bitumen in cyclohexane that prevented the attachment of the probe onto the bitumen surface. 73 Different from the force curves in cyclohexane, attraction and adhesion force were detected in 74 heptane. In the poor solvent (heptane), the bitumen layer was compressed and thus the steric force 75 was weakened. As a result, attraction and adhesion force could arise from van der Waals 76 interaction between the two surfaces. The steric mediated asphaltene adsorptions in different types 77 of organic solvents (toluene, heptane, and mixtures of both) were also supported in a series of work, 78 through the measurement of solid-asphaltene interaction by AFM [12], interaction between 79 asphaltene surface and mica surface by surface forces apparatus (SFA) [12,14,15,20], as well as 80 the AFM image of coated asphaltene on mica surfaces [12–15]. Besides the cases in organic 81 solvents, the interaction between asphaltene and solid surface (silicon nitride AFM tip) was also 82 investigated in aqueous solutions using AFM and SFA by Zhang et al. [17]. The measured results 83 showed that the tip-asphaltene interaction under appropriate pH could be well described by the 84 DLVO theory, i.e., van der Waals and electrostatic interactions dominated the tip-asphaltene 85 interaction. Bantignies et al. [21] compared the asphaltene adsorption on Kaol in toluene and in 86 toluene-water mixture using XRD and FTIR spectroscopy. The change in spectra bands showed 87 that the addition of water clearly affected adsorption on the alumina surface of Kaol (containing 88 hydroxyl surface groups), while adsorption on the siloxane surface was insensitive to water.

The conformation of molecules at the solid-liquid interface is vital to the study of asphaltene adsorption, such as predicting the adsorbed amount [22,23], calculating the adsorption isotherm [22], and identifying the wettability change of the solid surface [23,24]. The AFM images and surface force measurement between two C5Pe films in the work of Wang et al. [16] suggested that when adsorbed on mica in aqueous solutions, C5Pe tended to form a micelle-like aggregate with

94 the hydrophilic exposed to both aqueous solution and mica surfaces. Simulations by Liu et al. [19] 95 showed that a single C5Pe molecule tended to lie flat on the interface between water and a 96 hydrophilic or hydrophobic surface, as well as at the interface between ethanol and a hydrophobic 97 surface. However, the molecule preferred to be tilted on the interface between ethanol and a 98 hydrophilic solid. Xiong et al. [25] showed that aggregates of model asphaltenes (C5Pe and its 99 derivatives) adsorbed at the silica-heptane interface in a single-layer structure where the molecules 100 were perpendicular or slant to the solid. On the other hand, MD simulation of Lan et al. [26] 101 demonstrated multi-layer adsorption of a different model asphaltene (violanthrone-79 (VO-79), 102 with alkanes composing the side chain) on silica from organic solvents (toluene, heptane, and 103 mixtures of both with different ratios). In the multi-layer structure, adsorbed VO-79 molecules 104 were either parallel or slant to the silica surface, while VO-79 adsorbed as monomers were only 105 parallel. Monolayer and multilayer adsorptions of asphaltene have both been supported by 106 experimental evidence [22,23,27].

107 From the previous works, the adsorption behaviors of asphaltenes depend on the nature of the 108 solid-liquid interfaces, and different conformations were reported for similar interfaces. In order 109 to understand the complex phenomena observed, it is desirable to quantify the strength of 110 adsorption on different interfaces, through molecular level free energy calculations. Moreover, 111 neutral asphaltene with carboxylic terminal was adopted in most of the previous work, while 112 deprotonated asphaltene is ubiquitous throughout the petroleum exploration and development 113 stages, regulated by the environmental pH [28,29]. For example, saline water with a pH of 8-9 was 114 usually employed to recover the bitumen from oil sand ores, during which the carboxylic groups 115 could become deprotonated [30,31]. Ample evidence exists for the importance of acidic 116 functionalities of asphaltenes to their interfacial behaviors [32,33]. The adsorptions of

117 deprotonated asphaltene monomers and aggregates on solid surfaces thus demand more 118 investigation. Furthermore, while the previous works studied asphaltene adsorption in the presence 119 of a single type of solid surface, in reality asphaltenes often encounter mixed types of surfaces 120 simultaneously [34,35]. For example, in the flotation process bitumen could be exposed to surfaces 121 with distinct wettability [34,36]. In the enhanced oil recovery (EOR) process, asphaltene 122 precipitated between surfaces with different wettability, deteriorating the oil recovery efficiency 123 [31,35,37]. Last but not least, in the complex fluid media during oil transportation, or in the oil 124 sands tailings ponds for solid-water separation, asphaltenes were found to participate in hetero-125 coagulation of clay particles [38]. Different clay surfaces may mutually influence their ability to 126 adsorb asphaltenes, leading to complex yet interesting adsorption behaviors.

127 In this work, MD simulations and potential of mean forces (PMF) calculations were performed 128 for the first time to study the adsorption of deprotonated asphaltene at different solid-liquid 129 surfaces. MD simulation has been validated by extensive experimental work as a powerful tool in 130 predicting asphaltene's interfacial behaviors and is especially advantageous in probing the 131 molecular conformation and energetics [39,40]. Kaol is a typical clay mineral present in oil 132 production; it has been well demonstrated that the alumina basal surface of Kaol is hydrophilic 133 while the siloxane basal surface is relatively more hydrophobic [41–43], making Kaol a superior 134 candidate to study the effect of surface properties on asphaltene adsorption. Both water and model 135 oil (toluene and heptane) were used as the solvent to mimic the environment in which asphaltene 136 deposition occurs. This systematic study allowed us to gain both qualitative and quantitative 137 insights into how the interplay between solid types, solvent property, and aggregation contributes 138 to the adsorption of asphaltenes on solid-liquid interfaces.

139 2. Simulation Methods

140 **2.1. Models & Systems**

The deprotonated C5Pe was employed as the adsorbate, which consisted of a hydrophilic head and a hydrophobic body [7], as shown in Figure 1a. C5Pe has remarkable surface activity and its similarities with asphaltene in terms of intermolecular forces have been validated in our previous experimental works [5–12]. The acidic carboxylic group in the hydrophilic head was deprotonated, resulting in a charge of -1. The adsorbent was represented by Kaol (see Figure 1b for the unit cell of Kaol), a natural clay mineral composed of one octahedral alumina sheet and one tetrahedral siloxane sheet [46].



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Figure 1. (a) Molecular structure of the deprotonated C5Pe and (b) unit cell of Kaol. Color scheme
 for atoms in Kaol: Si (yellow), Al (pink), O (red), and H (white).

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Two groups of simulations were performed, as shown in Table 1. In the first group, the motion of a single C5Pe molecule was studied between two alumina surfaces (one Kaol plate at the bottom and one flipped Kaol plate at the top of the simulation box, see Figure 2a), between two siloxane

155 surfaces (one flipped Kaol plate at the bottom and one Kaol plate at the top, see Figure 2b), and 156 between one alumina and one siloxane surfaces (one Kaol plate at the bottom of the simulation 157 box, implying an identical plate at the top due to the application of periodic boundary condition 158 (PBC), see Figure 2c). The systems, each of size $4.12 \times 4.47 \times 5.00$ nm³, were solvated by water, 159 toluene, and heptane, respectively, and were named based on the solid and solvent types. For 160 example, system Al-Al-Wat corresponds to the system where the C5Pe was between two alumina 161 surfaces and in water. The number of solvent molecules is such that the equilibrated fluid density 162 is about 1000 kg/cm³, 862 kg/cm³ and 680 kg/cm³ respectively for water, toluene and heptane, the 163 expected values under 300K and 1 bar. In addition to these 9 simulations where the C5Pe was free 164 to move, for systems Al-Si-Wat, Al-Si-Tol and Al-Si-Hep, umbrella sampling (US) [47] 165 simulations were performed to calculate the PMF of the C5Pe molecule as it was pulled away from 166 one surface towards the other.

167 In the second group of simulations, twelve deprotonated C5Pe molecules were added into the 168 three solvents, each sandwiched between one alumina and one siloxane surfaces, to analyze the 169 adsorption of C5Pe aggregates. The C5Pe molecules were initially added into the systems (size 170 $8.25 \times 8.94 \times 8.00$ nm³) in the form of $2 \times 3 \times 2$ array in the middle of the boxes. In all the simulated systems, the negative charges of C5Pe molecules were neutralized by Ca²⁺ and Cl⁻. Divalent 171 172 cations have been shown to suppress the electric double layer around charged molecules, thus 173 promoting the adsorption [48]. The presence of 12 C5Pe corresponded to the concentration of 23-174 33 g/L in the solvents, which was higher than the concentrations commonly seen in experiments 175 [49–51]. Due to the size limitation in MD simulations, it was not possible to reproduce the bulk 176 concentration of polymer molecules in experiments. On the other hand, the higher concentration used mimicked the fact that the concentration of the asphaltene near the clay surface should bemuch higher than that in the bulk solution.

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_	Table 1. Simulated Systems				
	system name	solid surfaces	solvent	number of C5Pe	Number of ions
-	Al-Al-Wat	alumina-alumina	water	1	$1 \text{ Ca}^{2+}, 1 \text{ Cl}^{-}$
	Si-Si-Wat	siloxane-siloxane	water	1	$1 \text{ Ca}^{2+}, 1 \text{ Cl}^{-}$
	Al-Si-Wat	alumina-siloxane	water	1	$1 \text{ Ca}^{2+}, 1 \text{ Cl}^{-}$
	Al-Al-Tol	alumina-alumina	toluene	1	$1 \text{ Ca}^{2+}, 1 \text{ Cl}^{-}$
	Si-Si-Tol	siloxane-siloxane	toluene	1	1 Ca ²⁺ , 1 Cl ⁻
	Al-Si-Tol	alumina-siloxane	toluene	1	$1 \text{ Ca}^{2+}, 1 \text{ Cl}^{-}$
	Al-Al-Hep	alumina-alumina	heptane	1	$1 \text{ Ca}^{2+}, 1 \text{ Cl}^{-}$
	Si-Si-Hep	siloxane-siloxane	heptane	1	$1 \text{ Ca}^{2+}, 1 \text{ Cl}^{-}$
	Al-Si-Hep	alumina-siloxane	heptane	1	$1 \text{ Ca}^{2+}, 1 \text{ Cl}^{-}$
-	Wat-12	alumina-siloxane	water	12	6 Ca ²⁺
	Tol-12	alumina-siloxane	toluene	12	6 Ca ²⁺
	Hep-12	alumina-siloxane	heptane	12	6 Ca ²⁺

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182 **2.2. Simulation details**

The MD simulations were carried out with the GROMACS 2019 open source package [52–54]. The geometry of the deprotonated C5Pe was first optimized by density functional theory (DFT) at B3LYP/6-31+G (d) level in Gaussian 16 [55]. The topology for the deprotonated C5Pe was converted from the optimized coordinate files using Automated Topology Builder (ATB) [56].

The force field parameters in the topology were from the GROMOS 96 54A7 force field parameter set [57] except for the partial atomic charges, which were produced using the CHelpG method [58] after the DFT optimization. The topology for Kaol was developed and validated in our previous work [59], where the CLAYFF force field [60,61] was adopted with all partial atomic charges unaltered. Force fields of toluene and heptane were validated in the Lan et al [26]. SPC was adopted as the water model.

193 Each system containing a single C5Pe molecule was first minimized by the steepest descent 194 method to limit the maximum force to 1000.0 kJ/(mol·nm). The minimization was followed by 195 simulated annealing where the solid plates was frozen, and the temperature of other molecules was 196 slowly increased from 300 K to 800 K and then decreased back to 300 K. Production MD 197 simulation was then performed in NP_zT semi-isotropic ensemble (pressure coupling only in the z-198 direction, which is the direction perpendicular to the solid surfaces) for 10 ns. During the NP_zT 199 simulations, position restraints were applied to the heavy (non-hydrogen) atoms of the lower plate, 200 while the upper plate could move in the z-direction working as a piston. The only exception was 201 the system between two siloxane surfaces in water (see Figure 2b), which was simulated in NVT 202 ensemble with position restraints applied on both plates. Due to the application of PBC, when two 203 siloxane surfaces were facing the solvent, the two alumina surfaces in neighbour cells were closely 204 stacked. In water, the strong attraction between the two alumina (hydrophilic) surfaces could lead 205 to structural distortion in the system, and as such special care was taken by using the NVT 206 ensemble. Evidence was presented in the supporting information (SI, Section S1) that the 207 simulation results were not affected by the choice of ensembles.

For the PMF calculation using US, the reaction coordinate was chosen to be the distance (d_{COM}) from the center of mass (COM) of C5Pe to the surface of the bottom plate, which was defined by the average *z* coordinates of the surface oxygens. The C5Pe molecule was first pulled in the *z*direction from the alumina surface towards the siloxane surface, at a speed of 1 nm/ns. A total of 50-100 configurations with different d_{COM} were taken from the pulling trajectories and for each configuration, harmonic biasing potential was applied on the COM of C5Pe for 10 ns of US. During the US, NP_{xy}T simulation was performed so that the *z* dimension of the simulated box was unvaried, ensuring consistent measurement of d_{COM} . Finally, the PMF as a function of d_{COM} was calculated by the weighted histogram analysis method [62].

The systems containing 12 C5Pe molecules were simulated following the same procedure as the systems containing a single C5Pe molecule, except that the production run was conducted for 80 ns. For all simulations, Nose-Hoover thermostat [63,64] and Parrinello–Rahman barostat [65] were employed to control the temperature and pressure at 300 K and 1 bar respectively. Cut-off distance for van der Waals and short-range electrostatic interactions was 1 nm, and particle mesh Ewald method [66] was used to calculate long-range electrostatic interactions.

223 **3. Results and Discussion**

3.1. Adsorption of C5Pe monomer

225 The final configurations of the deprotonated C5Pe molecule when placed in water between two 226 alumina surfaces, between two siloxane surfaces, and between one alumina and one siloxane 227 surfaces are shown in Figure 2a-2c, respectively. Statistics from the last 5 ns of the simulations, 228 for the distance d_{COM} from the nearest surface is shown in Figure 2j, and statistics for the angle θ 229 between the PAH plane (defined by three carbon atoms of the PAH) of C5Pe and the solid surfaces 230 (xy plane) is shown in Figure 2k. In the last 5 ns, d_{COM} in system Al-Al-Wat (Figure 2a) fluctuated around ~0.8 nm. The angle θ had an average of ~35° but the standard deviation was high, 231 232 suggesting that the C5Pe molecule was loosely adsorbed near the bottom alumina surface. When 233 the C5Pe molecule was between two siloxane surfaces in system Si-Si-Wat (Figure 2b), d_{COM} 234 converged to ~0.33 nm and the angle θ was ~10°. Compared with system Al-Al-Wat, the C5Pe 235 molecule displayed a more stable adsorption on the siloxane surface, with a closer distance and 236 flatter configuration. In system Al-Si-wat, the C5Pe molecule adsorbed on the alumina surface, 237 which was in contrast to the systems containing identical surfaces where the adsorption appeared 238 stronger in Si-Si-Wat than in Al-Al-Wat. d_{COM} between C5Pe and the alumina surface fluctuated 239 heavily between 0.9 and 1.3 nm, suggesting that the C5Pe molecule was not as stably adsorbed on 240 the alumina surface as in system Al-Al-Wat. In addition, there was no preferred angle between the 241 PAH plane and the alumina surface. Thus, the adsorption of C5Pe was affected by the presence of 242 dissimilar surfaces.

243 In toluene, as shown in Figure 2d-2f, the C5Pe molecule became adsorbed in all three settings 244 of solid surfaces. In systems Al-Al-Tol and Al-Si-Tol (Figure 2d, f) where C5Pe adsorbed on the 245 alumina surface, $d_{\rm COM}$ shown in Figure 2l converged to 0.38 nm. The angles θ was around 10° in 246 both systems, suggesting a flat configuration. In system Si-Si-Tol, d_{COM} fluctuated around 0.41 nm 247 and the angle θ was ~30° with the siloxane surface. In heptane, the C5Pe molecule became 248 adsorbed in the two systems with symmetrical surface setting (Figure 2g, h), with d_{COM} converging 249 to 0.3-0.5 nm and θ <30°. However, when C5Pe was placed between two dissimilar surfaces, its 250 adsorbed configuration was different in heptane compared with in toluene. Contrasted with the 251 preferred adsorption on the alumina surface in toluene, in heptane the C5Pe molecule favoured the 252 siloxane surface. The angle between C5Pe and the siloxane surface was $\sim 80^{\circ}$, suggesting a nearly 253 perpendicular configuration in system Al-Si-Hep.

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256 257 Figure 2. Final configurations of systems (a) Al-Al-Wat, (b) Si-Si-Wat, (c) Al-Si-Wat, (d) Al-Al-Tol, 258 (e) Si-Si-Tol, (f) Al-Si-Tol, (g) Al-Al-Hep, (h) Si-Si-Hep, and (i) Al-Si-Hep. Statistics for the distance 259 dCOM between COM of C5Pe and the nearest surface, as well as the angle between PAH plane of 260 C5Pe and the solid surfaces, in systems solvated by water (j, k), toluene (l, m), and heptane (n, o). In 261 (a)-(i), color scheme for atoms in Kaol is the same as in Figure 1, color scheme for C5Pe and ions: C 262 (cyan), N (blue), O (red), Ca2+ (black) and Cl- (ice blue). Data from the last 5 ns of the simulations 263 were used to generate the box-and-whisker plots in (j)-(o), where the box was created from the first 264 quartile to the third quartile and the horizontal line inside the box denotes the median. From the 265 upper/lower quartiles (boundaries of the box), whiskers were drawn to the largest/smallest datapoint 266 (the farthest datapoint) that fell within 1.5 times the box length. Other datapoints not included within 267 the whiskers were plotted as dots.

268 3.2. Mechanisms of monomer adsorption

269 The non-bonded interaction energies the hydrophilic carboxylate head and hydrophobic body 270 (Figure 1a) of C5Pe had with the solid plate it became adsorbed on are shown in Figure 3a for the 271 case of toluene being the solvent. The results in water and heptane are shown in Supporting 272 Information (SI), Section S1. In system Al-Al-Tol, the Coulombic interaction between the 273 carboxylate head and the alumina surface was repulsive, where the oxygen of carboxylate and the oxygen of surface hydroxyl simultaneously formed coordination bonds with Ca^{2+} . The 274

coordination is quantified in Figure 3b and illustrated in Figure 3c. Ca²⁺ provided local charge 275 276 neutralization so that the negative carboxylate and the hydroxyl group of the alumina surface could 277 stay near each other. In contrast with system Al-Al-Tol, the Coulombic interaction between the 278 carboxylate head and the alumina surface was attractive in system Al-Si-Tol, where the 279 carboxylate group adsorbed on the surface by forming hydrogen bonds (H-bonds) with the surface OH group, instead of coordinating to Ca^{2+} , as shown in Figure 3b and illustrated in Figure 3d. In 280 281 system Si-Si-Tol, the Coulombic interaction between the negatively charged carboxylate and surface oxygen was again repulsive and they both formed coordination bonds with Ca^{2+} , as 282 illustrated in Figure 3e. Since the deprotonated C5Pe could only act as H-bond acceptor and the 283 284 siloxane surface contained no protons, H-bonds were absent between C5Pe and the siloxane 285 surface. Compared with the Coulombic interaction, the van der Waals force (quantified by the 286 Lenard-Jones potential) contributed little to the adsorption of carboxylate on either type of the 287 surfaces.

Unlike the carboxylate head whose interactions with the surfaces were dominated by electrostatics, both van der Waals and Coulombic forces contributed to the interaction of the large hydrophobic body of C5Pe with the surfaces. The Coulombic force was attractive when the hydrophobic body formed H-bonds with the alumina surface through the N and O atoms of PAH (in systems Al-Al-Tol and Al-Si-Tol), while repulsive when the oxygens of PAH and surface oxygens simultaneously coordinated to Ca^{2+} (in system Si-Si-Tol).



(a) Group (b) Head black for the form of the black form G_{froup} Figure 3. (a) Coulombic and Lenard-Jones (LJ) interaction energies between the hydrophilic head of C5Pe and the solid plate it adsorbed on in systems Al-Al-Tol (h-Al-Al), Si-Si-Tol (h-Si-Si), and Al-Si-Tol (h-Al-Si), as well as the corresponding values for the hydrophobic body (b-Al-Al, b-Si-Si, and b-Al-Si). (b) Average number of coordination bonds n_{coord} and H-bonds n_{hbond} between C5Pe and the surface it adsorbed on. All data were extracted from the last 5 ns of simulation. Snapshots extracted from system Al-Al-Tol (c), Al-Si-Tol (d), and Si-Si-Tol (e). Color scheme is the same as in Figure 2. 301

302 While the above energy analysis revealed means by which C5Pe can interact with the surfaces, 303 thermodynamics of adsorption could be better understood by PMF calculations. Since systems Al-304 Si-Wat, Al-Si-Tol, and Al-Si-Hep contained all types of solid-liquid interfaces investigated, the 305 PMF was calculated in these three systems and shown in Figure 4. Due to fluctuations, each PMF 306 displayed a number of local minima along d_{COM} . We focused on the most prominent minima 307 associated with considerable depth, and identified the configurations corresponding to these 308 minima. The other shallower minima were also examined and they formed transitional states 309 between the discussed minima. In water (Figure 4a), the first minimum at $d_{\rm COM} \approx 0.5$ nm 310 corresponded to the configuration where C5Pe laid flat on the alumina surface with its carboxylic 311 terminal forming H-bonds with the Al-OH groups. The second minimum at $d_{\text{COM}} \approx 1.5$ nm had a 312 lower PMF than the first minimum ($\Delta G_1 = -6.86 \text{ kJ/mol}$), suggesting a more stable adsorption. In this minimum, C5Pe was tilted to the alumina surface while maintaining the H-bonds. After the 313 314 second minimum, the PMF kept an increasing trend with $d_{\rm COM}$, implying the resistance of C5Pe to 315 solvation in water. When C5Pe was sufficiently close to the siloxane surface, another minimum 316 appeared at $d_{\text{COM}} \approx 3.4$ nm, with almost the same PMF value as the second minimum ($\Delta G_2 = 0.09$

kJ/mol). This minimum corresponded to another favorable adsorption configuration: C5Pe adsorbed on the siloxane surface with the hydrophilic head extending to the solvent (water) and the hydrophobic body lying flat on the surface. The most energetically favorable configuration was suggested by the lowest minimum along the reaction coordinate, which occurred at $d_{\rm COM} \approx$ 3.9 nm where C5Pe adsorbed on the siloxane surface with its PAH plane perpendicular to the surface.

323 The free energy changes (ΔG) when the C5Pe molecule was moved from the middle of the bulk 324 solution (marked by star in Figure 4a) to the energetically most favorable position near each 325 surface (the second and the fourth energy minima in Figure 4a) were calculated in Figure 4d, as 326 well as the enthalpic (ΔH) and entropic contributions ($T\Delta S$). ΔG was obtained from the PMF, ΔH 327 calculated from $\Delta H = \Delta U + p \Delta V (U, p \text{ and } V \text{ respectively the total internal energy, pressure, and}$ 328 volume of the system), and $T\Delta S$ determined from $T\Delta S = \Delta H - \Delta G$. To become adsorbed, the C5Pe 329 molecule needed to replace the water molecules in the hydrated layer near the solid surfaces. When 330 adsorbed at the alumina-water interface, ΔG (-5.3 kJ/mol) was mainly from ΔH (-5.0 kJ/mol), 331 suggesting that the adsorption was driven by enthalpy. The strong attraction of the carboxylate 332 group of C5Pe to the polar alumina surface facilitated water replacement on the surface so that 333 C5Pe could be adsorbed. On the other hand, compared with water, the hydrophobic part of C5Pe 334 had a weaker attraction to the alumina, and thus the adsorption was in a tilted configuration leaving 335 the hydrophobic part unabsorbed. Contrastingly, at the siloxane-water interface, ΔG (-8.4 kJ/mol) resulted from simultaneous increase of enthalpy ($\Delta H = 53.9$ kJ/mol) and entropy ($T\Delta S = 62.3$ 336 337 kJ/mol). In this case, the adsorption was driven by entropy. As C5Pe adsorbed on the siloxane 338 surface, a fraction of water molecules previously confined near the surface and around C5Pe were

released into the bulk, and the entropy of water release was the main force driving this most stableadsorption.

341 Free energy analyses in Figure 4 can provide some insights into the observations made in Figure 342 2. Figure 4d suggests that C5Pe adsorption was mainly driven by enthalpy in system Al-Al-Wat, 343 while by entropy in system Si-Si-Wat. ΔG had a larger magnitude for adsorption on siloxane and 344 as such the adsorption on alumina (Figure 2a, j, and k) was not as stable as the adsorption on 345 siloxane (Figure 2b, j, and k). In system Al-Si-Wat, when the C5Pe was between two dissimilar 346 surfaces, a competition existed between the two surfaces and theoretically C5Pe could adsorb at 347 either interface. In Figure 2c, C5Pe was observed to adsorb on the alumina surface because it was 348 initially placed near the middle of the simulation box where $d_{\rm COM} \approx 2.3$ nm. Based on the PMF in 349 Figure 4a, it was easier for the C5Pe molecule to move from $d_{\text{COM}} \approx 2.3$ nm towards the minimum 350 at $d_{\rm COM} \approx 1.5$ nm (near alumina surface) while two energy barriers would need to be overcome to 351 reach the PMF minimum at $d_{\text{COM}} \approx 3.9$ nm (near siloxane surface).

352 The PMF in toluene also displayed two minima near each surface ($d_{\text{COM}} \approx 0.4 \text{ nm}, 1.6 \text{ nm}, 3.9$ 353 nm, and 4.3 nm), corresponding to two types of configurations, flat and tilted, as shown by the 354 snapshots in Figure 4b. The changes of free energy, enthalpy, and entropic terms when C5Pe was 355 moved from the bulk solution to the first ($d_{COM} \approx 0.4$ nm, lowest minimum near alumina) and the 356 fourth minimum ($d_{\text{COM}} \approx 4.3$ nm, lowest minimum near siloxane) were calculated in Figure 4d. 357 $T\Delta S$ was negative for both interfaces, implying that entropy played against the adsorption of C5Pe 358 in toluene. The movement of C5Pe from the bulk to the surface, followed by adsorption in a flat 359 form, would cause a decrease in the configurational entropy, which might surpass the entropy 360 increase caused by solvent release. The entropy decreased more at the alumina surface than at the 361 siloxane surface because of the flatter configuration of C5Pe. The negative ΔH values in Figure 4d 362 confirmed that the adsorption of C5Pe in toluene was enthalpy driven. As shown in Figure 3a, the 363 total non-bonded energy between the alumina surface and C5Pe (summation of contributions from 364 the hydrophilic head and hydrophobic body, in systems Al-Al-Tol and Al-Si-Tol) was larger in 365 magnitude than the one between the siloxane surface and C5Pe (in system Si-Si-Tol), and thus ΔH 366 as well as ΔG were more negative at the alumina-toluene interface. As a result, the adsorption in 367 system Al-Al-Tol was more stable (less fluctuated d_{COM} and θ in Figure 21 and m) than that in 368 system Si-Si-Tol (Figure 2d and e). Similarly, between two dissimilar surfaces in toluene, the C5Pe 369 molecule preferred the alumina surface (Figure 2f).

370 In heptane, similar to the case in toluene, the PMF curve had two minima near each surface 371 $(d_{\text{COM}} \approx 0.4 \text{ nm}, 1.5 \text{ nm}, 3.6 \text{ nm}, \text{and } 4.1 \text{ nm})$ resulting from different C5Pe configurations. One 372 notable distinction from toluene is that in heptane C5Pe underwent an orientation reversal as it 373 departed from the alumina surface and approached the siloxane surface (Figure 4c). The reversal 374 arose from the fact that the aliphatic side chains of C5Pe always preferred to stay solvated in 375 heptane which had similar aliphatic feature. Two additional minima were found as a consequence 376 of the orientation reversal: at $d_{\text{COM}} \approx 2.1$ nm and $d_{\text{COM}} \approx 2.8$ nm respectively. The adsorption of 377 C5Pe was also driven by enthalpy and hindered by entropy ($\Delta H < 0$ and $T\Delta S < 0$ in Figure 4d). 378 The alumina surface had larger attractions to C5Pe (see non-bonded energy analysis in SI, Section 379 S1) and hence larger enthalpy decrease. However, the entropy decrease is also greater near the 380 alumina surface, leading to similar ΔG for the two solid-heptane interfaces. As a result, C5Pe 381 displayed similar adsorption behavior (close values of $d_{\rm COM}$ and θ in Figure 2n and o) in systems 382 Si-Si-Hep and Al-Al-Hep, and should have similar tendency toward the two surfaces in system 383 Al-Si-Hep. Given that C5Pe in system Al-Si-Hep was initially placed at $d_{COM} \approx 2.5$ nm (near the 384 PMF peak in Figure 4c), the final adsorption on the siloxane surface seen in Figure 2i could be due

to the random velocities assigned at the beginning of the simulation, combined with the slightlysharper decline of the PMF towards the siloxane surface in Figure 4c.

387 The above results have shown that the mechanisms driving monomer adsorption of C5Pe on 388 the solid surfaces are distinct in water as compared to organic solvents. Entropy played a critical 389 role in promoting adsorption of C5Pe from water onto hydrophobic siloxane surface, while 390 enthalpy dominated the adsorption on other solid-liquid interfaces. In water, although the 391 adsorption on the hydrophobic (siloxane) surface was more stable when C5Pe was placed between 392 two identical surfaces, the molecule adsorbed on the hydrophilic (alumina) surface when placed 393 between the two dissimilar surfaces, due to the change of mechanism driving the adsorption. In 394 the organic solvents, C5Pe adsorption was always driven by enthalpy whether or not the two solid 395 surfaces were of the same type, and thus the adsorption favored the surface that yielded larger 396 enthalpy reduction.



397 398 Figure 4. PMF along d_{COM} when the C5Pe was between the alumina and siloxane surfaces of Kaol in 399 water (a), toluene (b), and heptane (c). The change of Gibbs free energy (ΔG), enthalpy (ΔH), and 400 entropic terms ($T\Delta S$) when C5Pe was moved from the bulk (marked by the star symbol) to the solid-401 water interfaces (Al-wat and Si-wat), solid-toluene interfaces (Al-tol and Si-tol), and solid-heptane 402 interfaces (Al-hep and Si-hep) (d).

403 3.3. Adsorption of C5Pe aggregates

404 One notable feature of C5Pe is its self-association where multiple molecules form aggregates 405 through π - π stacking of the PAH planes [7]. To explore the difference in adsorption of C5Pe 406 aggregates as compared to a single molecule, systems composed of 12 deprotonated C5Pe 407 molecules were simulated between one alumina and one siloxane surfaces using PBC. The density 408 profile of C5Pe vs. the distance to the alumina surface was plotted in Figure 5a, c and e, with the 409 final configurations shown as insets. In water (Figure 5a), the density peaked at ~ 1 nm from the

410 alumina surface (pointed by the arrow) and decayed to zero after 2.5 nm; 2.5 nm therefore 411 represented the thickness of the adsorbed C5Pe aggregate in water. Within the aggregate, C5Pe 412 molecules aggregated together as showed in the inset of Figure 5a. The evolution of aggregate size 413 with simulation time is shown in Figure 5b (see SI, Section S2 for the calculation details), 414 quantified by the number of C5Pe molecules in each aggregate. The number of aggregates is 415 indicated by the color bar on the right of Figure 5b. The aggregation occurred quickly in the pre-416 equilibration simulation and at the beginning of NPT simulation (0 ns in Figure 5b), one aggregate 417 with six C5Pe molecules was adsorbed on the surface. After 2 ns, another aggregate of size six 418 became adsorbed on the surface. The two aggregates merged into one bulky aggregate (Figure 5a) 419 after 35 ns. The aggregation in water was stable, evidenced by the steady aggregate size.

420 The density profile of C5Pe in toluene (Figure 5c) displayed distinct but overlapping peaks at 421 0.25 nm, 0.7 nm and 2.3 nm, respectively, and decayed to zero after 4 nm from the alumina surface, 422 indicating a three-layered adsorption with a total thickness of 4 nm. The three-layered 423 configuration is illustrated by the snapshot in Figure 5c, containing nine C5Pe molecules (last time 424 frame in Figure 5d). As shown in Figure 5d, at 0 ns of the NPT simulation, an aggregate containing 425 five molecules was adsorbed on the surface. The aggregate evolved dynamically, releasing and 426 attracting molecules/aggregates, and formed a multi-layered 9-mer in the end. The aggregates were 427 overall in smaller sizes and less stable than in water: through the 80 ns simulation the aggregate 428 size fluctuated significantly, between monomer and 11-mer.

In heptane, the density profile displayed two peaks at 0.25 nm and 0.7 nm respectively, near the alumina surface, and decreased to zero at 1.3 nm, suggesting a two-layered adsorption with a total thickness of 1.3 nm. In addition, there were two peaks in the density profile near the siloxane surface, at 6.9 nm and 7.1 nm, suggesting a two-layered adsorption with a thickness of ~0.5 nm. 433 Compared with the toluene and water systems, the aggregate size was smaller in the system 434 solvated by heptane (Figure 4f). One pentamer was formed and adsorbed in the 50-75 ns time 435 window, which was the largest aggregate that ever existed in the heptane system. Dimer, trimer, 436 and tetramer were all found throughout the simulation.





Figure 5. Density profile of C5Pe as a function of the distance from the alumina surface in systems solvated by water (a), toluene (c), and heptane (e), sampled from the last 20 ns of the simulations. Size of the adsorbed aggregate on both Kaol surfaces, in systems solvated by water (b), toluene (d), and heptane (f). In b, d, f, the color bar indicates the number of aggregates corresponding to a certain size. The size of an aggregate was quantified by the number of C5Pe molecules in it. Ca²⁺ ions are shown as black spheres.

444 3.4. Mechanisms of aggregate adsorption

445 As discussed in Section 3.2, the adsorption of C5Pe monomer was entropy driven on siloxane 446 surface in water, and enthalpy driven on other interfaces. In Section 3.3, adsorptions of C5Pe 447 aggregates were found on surfaces that were enthalpically favored. In addition, in toluene the 448 preferred adsorption on the alumina surface, as compared to siloxane, was consistent with the 449 lower ΔG value for monomer adsorption. In heptane, ΔG value for monomer adsorption was 450 comparable on the two surfaces, and in alignment with this, aggregate adsorption was found on 451 both surfaces. Both van der Waals and Coulombic forces contributed to enthalpy changes during monomer adsorption, and the Coulombic interaction was strongly affected by H-bonding and Ca²⁺ 452 453 coordination. For the adsorption of C5Pe aggregates, besides the interaction with the surface, 454 mutual interaction among C5Pe molecules also participated in regulating the adsorption.

455

3.4.1. Ca²⁺ coordination and H-bonds

Ca²⁺ in the solution can provide local charge neutralization and establish bridges between C5Pe 456 457 and the surfaces through the formation of coordination bonds. The numbers of coordination bonds formed with the Ca^{2+} (denoted as N_{coord}) in the systems containing twelve C5Pe molecules and six 458 Ca²⁺ are shown in Figure 6 (see SI, Section S2 for the calculation details). In the system solvated 459 by water, all the six Ca^{2+} were only coordinated to water oxygens (Figure 6a), despite the presence 460 of a carboxylic group in C5Pe which intuitively could have higher electrostatic attraction to Ca^{2+} . 461 462 The number of N_{coord} formed with water oxygens was 4-6, consistent with the structure of hydrated Ca^{2+} reported in the literature [67]. The absence of Ca^{2+} coordination with the carboxylic group of 463 464 C5Pe might result from the stronger attraction the carboxylic group had with the surface hydroxyl 465 groups (see Section 3.4.2 for H-bonds calculation). After the C5Pe aggregate adsorbed on the 466 alumina surface, the Kaol plate exhibited a net negative charge. As a result, the hydrated 467 (coordinated) Ca^{2+} stayed in the stern layer of the anionic Kaol plate (see SI, Section S1 for more 468 details), as shown in Figure 5a. Ca^{2+} thus did not help the aggregation or the adsorption of C5Pe 469 in water.

In toluene, Ca^{2+} was coordinated to both the Kaol surface and the C5Pe molecules (Figure 6b). 470 The surface coordinated to two Ca^{2+} (Ca 4 and Ca 6) through the bridging oxygens in the siloxane 471 layer or the hydroxyl oxygens in the alumina layer, with $N_{coord} = 6-7$ per ion. Meanwhile, four Ca²⁺ 472 473 (Ca 1, Ca 2, Ca 3, and Ca 5) were coordinated to the C5Pe molecules, each forming 6-7 474 coordination bonds through the oxygen atoms on the carboxylic groups and the PAH plane. Multiple C5Pe molecules were bridged together when simultaneously coordinating to one Ca²⁺. In 475 476 fact, the three layers of C5Pe near the alumina surface in toluene were bridged together through the Ca^{2+} bridges, as evidenced by the correlation between the density profiles of Ca^{2+} and C5Pe 477 (SI, Section S1). While Ca²⁺ participated in aggregating C5Pe molecules, it is interesting to note 478 that no Ca^{2+} bridges were found between C5Pe and the alumina surface, i.e., Ca^{2+} did not contribute 479 480 to the direct adsorption of C5Pe. Here a C5Pe molecule was considered to be directly adsorbed 481 when its minimum distance from the solid surface was within 0.25 nm (see SI, Section S2 for the justification). Instead, Ca²⁺ promoted C5Pe adsorption by connecting the molecules together into 482 483 a loosely packed multi-layer structure which in turn adhered to the surface.

In heptane, Ca^{2+} was coordinated to C5Pe (Ca_3, Ca_5, and Ca_6), Kaol (Ca_1 and Ca_4), as well as C5Pe and Kaol simultaneously (Ca_1, Ca_2, Ca_4, and Ca_5) at different stages (see SI, Section S1 for the real-time dynamic data). The coordination of C5Pe or Kaol to Ca²⁺ was similar to that in toluene, with 6-7 coordination bonds per Ca²⁺. Compared to the case in toluene, Ca²⁺ in heptane played the additional role of bridging C5Pe and the surface together and stabilizing the directly adsorbed molecules (SI, Section S1 for evidence from the density profiles).

490 H-bonding also played an important role in the direct adsorption of C5Pe molecules. The 491 average number of H-bonds (N_{hbond}) formed by each directly adsorbed C5Pe molecule with the 492 alumina surface was calculated and shown in Figure S7 (SI, Section S1). Both oxygens from the 493 carboxylate group and the PAHs can form H-bonds with the surface. The maximum number of H-494 bonds a C5Pe molecule could form with the alumina surface was eight (via all available N and O 495 atoms) which corresponded to a completely flat adsorption. Among the three solvents, $N_{\rm hbond}$ was 496 the least in water, which was attributed to the titled configuration of C5Pe aggregates (Figure 5a) 497 that limited the opportunities of N and O atoms in the PAH plane to form H-bonds. In contrast, the 498 nearly flat configuration in toluene and heptane (Figure 5c and e) benefited the H-bonding between 499 the available groups on C5Pe and the hydroxyl groups on the alumina surface.



500 (a) ca²⁺ (b) ca²⁺ (c) ca²⁺
501 Figure 6. Average number of coordinate bonds formed with each Ca²⁺ when coordinated to water
502 (Ca-Water), C5Pe (Ca-C5Pe), Kaol (Ca-Kaol), as well as C5Pe and Kaol simultaneously (C5Pe-Ca503 Kaol). The data was sampled from the last 20 ns of simulated time in systems solvated by water (a),
504 toluene (b), and heptane (c).

506 **3.4.2. Interplay between adsorption and aggregation**

507 In water, the C5Pe molecules aggregated together despite the -1 charge each carried. The polar 508 solvent partly screened the Coulombic repulsion between the hydrophilic heads, enabling local 509 attractions between the hydrophobic PAHs through π - π stacking, resulting in the formation of a 510 bulky aggregates. To minimize the contact with water, the aggregate should have been in a sphere-511 like shape with the hydrophilic head reaching out to the solvent. However, attracted by the alumina 512 surface, the hydrophilic head tended to form H-bonds with the solid surface via the carboxyl groups 513 of C5Pe and the surface hydroxyl groups, driving the direct adsorption of some C5Pe molecules 514 in the aggregate (Figure 5a). Consistent with C5Pe monomer (Figure 2c), the adsorption was near 515 the alumina surface with a similar titled configuration (see Figure 7a and Figure 2k for the statistics 516 on angle). The angle θ between all C5Pe molecules and the surface was in the same range as the 517 directly adsorbed C5Pe molecules (Figure 7a), suggesting that the indirectly adsorbed molecules 518 were stabilized near the surface via the π - π stacking that was parallel with the directly adsorbed 519 ones. The aggregation did not bring noticeable effects on the adsorption of C5Pe in water.

520 In toluene, the aggregation of C5Pe was undermined due to the competition of π - π stacking 521 between toluene and PAH of C5Pe. The aggregates were thus in smaller size compared with that 522 in water. The aggregates were either directly adsorbed, or adsorbed on other directly adsorbed 523 aggregates, resulting into a multi-layered structure. θ of the directly adsorbed molecules (in the 524 first adsorption layer) in aggregates fell into a wide range ($0^{\circ}-90^{\circ}$) and peaked at ~10°, as shown 525 in Figure 7b. Compared with the (directly) adsorbed monomer whose θ concentrated at the 0°-50° 526 range, the directly adsorbed molecules in aggregates showed an increased tendency to be in a tilted 527 configuration. Therefore, the direct adsorption of molecules was affected by other molecules from 528 the aggregates. As mentioned in Section 3.3, the adsorbed aggregates evolved dynamically on the 529 surface (Figure 5d). Due to the strong enthalpic attraction from the surface, the molecules in an 530 aggregate that became directly adsorbed early in the simulation tended to conform to the surface 531 with their PAH being parallel. For the molecules that became directly adsorbed later in the 532 simulation, their conformation could be affected by the previously adsorbed molecules. For 533 example, for the molecule circled in Figure 5c, its tilted adsorption was a result from its interaction 534 with the surface (mainly through H-bonding and van der Waals force) and its interaction with a neighboring molecule (mainly through π - π interaction and Ca²⁺ coordination). The indirectly adsorbed molecules (those in the second and third layers as showed in Figure 5c) preferred a nearly perpendicular configuration with θ peaked at ~80° (Figure 7b). The second and third layers were kept in the thick aggregate through Ca²⁺ coordination and π - π interaction. They had little interaction with the surface, resulting in the nearly perpendicular configuration.

540 Similar to the adsorbed aggregate in toluene, configuration of directly adsorbed C5Pe in 541 heptane was mediated by both adsorption and aggregation. Molecules in the second layer (Figure 542 5e and f) were indirectly adsorbed through aggregation with the molecules in the first layer. In 543 contrast with water, both the hydrophobic and hydrophilic parts of C5Pe interacted strongly with 544 the surface. Compared with toluene, heptane is a poor solvent for C5Pe, and thus the molecules 545 tended to quickly minimize their contact area with the solvent and maximize the contact with the 546 solid surface in order to maintain a stable state. As a result, the probability for C5Pe to interact 547 with each other in the solvent was limited and the number of adsorbed monomers increased. This 548 led to a compact adsorption structure (Figure 5e). The thin adsorption structure still contained two 549 layers of C5Pe molecules more or less parallel to each other (Figure 7c), stabilized by the π - π stacking and Ca²⁺ coordination. 550

To conclude, in all three systems, π - π stacking is a main driving force for aggregation, while Ca²⁺ coordination also assisted in aggregation in organic solvents. The direct adsorption of C5Pe from an aggregate in organic solvents was mediated by both the enthalpic attraction from the surface and their interaction with other molecules in the aggregate. Meanwhile, the aggregation among C5Pe molecules induced indirect adsorption and multi-layer adsorbed structures.



556(a)Angle (*)(b)Angle (*)(c)Angle (*)557Figure 7. Probability distributions for the angle between the solid surface and PAH planes of directly558adsorbed C5Pe and all the C5Pe in water (a), as well as between the surface and adsorbed monomer,559directly adsorbed molecules from aggregates, and indirectly adsorbed molecules from aggregates in560toluene (b) and heptane (c).

561 **3.5 Implications**

562 This work revealed molecular mechanisms driving the adsorption of model asphaltene on 563 different types of surfaces in water, which could provide explanations to existing experimental 564 observations. The small enthalpy decrease for the adsorption on the hydrophilic surface would 565 result in weak adsorption, which explained why asphaltenes pre-adsorbed on hydrophilic surfaces 566 could be washed away by water [21]. Liu et al. [19] reported that asphaltene adsorption was more 567 stable on a hydrophobic surface than on a hydrophilic surface, which could be explained by the 568 finding in this work that the magnitude of entropy increase for adsorption on the hydrophobic 569 surface was larger than the enthalpy decrease on the hydrophilic surface. It can thus be expected 570 that for other amphiphilic polymers, their adsorption at different solid-water interfaces could be 571 tuned by adjusting the wettability of the surface. The simultaneous presence of two dissimilar 572 surfaces in water could have a large effect on the adsorption of amphiphilic molecules, mediated 573 by the attractions from both surfaces.

In organic solvents, entropic effects played against the adsorption while enthalpy drove the adsorption on both types of solid surfaces. Due to the presence of hydroxyl groups, the alumina surface gave rise to larger enthalpic attraction to C5Pe than the siloxane surface. The larger enthalpic attraction of alumina surface was also supported by DFT calculation by Johnson et al. 578 [68] which evaluated the adsorption energy of multiple organic molecules (benzene, n-hexane, 579 pyridine, and isopropanol) on kaolinite in vacuum. The MD result here is in agreement with the 580 microcalorimetry study by Pradilla et al. [24] where in toluene the enthalpy change of asphaltene 581 adsorption was found to increase with the polarity instead of the wettability of the solid surface. 582 Asphaltene also displayed preferable adsorption on the surface with hydroxyl terminals in other 583 organic media such as ethanol [19]. In heptane, as shown in the results, the preferred adsorption 584 on the alumina surface was less obvious, which might be attributed to the similar affinity of the 585 two surfaces to the solvent. DFT calculation[68] showed that organic molecules such as benzene 586 preferred to bind to the alumina surface. It can be deduced that in toluene the entropy gained from 587 solvent release upon C5Pe adsorption was less on the alumina surface than on the siloxane surface. 588 Together with the larger entropy loss due to a flatter C5Pe adsorption, the overall entropy decrease 589 was larger on the alumina surface. However, for n-hexane, its binding energy on the two types of 590 surfaces had a smaller difference compared with benzene [68]. It can thus be inferred that in 591 heptane the difference in entropy gain from solvent release was smaller, resulting in closer values 592 of entropy change upon C5Pe adsorption on the two types of surfaces. (In Figure 4d, when heptane 593 was the solvent $T\Delta S$ decreased 25% from C5Pe adsorption on siloxane to adsorption on alumina, 594 while the corresponding reduction was 44% in toluene. ΔH exhibited the same characteristics: 595 from adsorption on siloxane to alumina, the difference was 22% in heptane and 45% in toluene. The conformation of asphaltene aggregates on the solid surface was solvent dependent. In water, 596 597 C5Pe aggregated together on the hydrophilic surface with the hydrophobic parts exposed to water

(Figure 5a). The measurement of surface force between two C5Pe films in aqueous solutions by
Wang et al. [16] also suggested the formation of C5Pe aggregates as well as the hydrophobic
domains of the adsorbed C5Pe aggregates on mica surface. In organic solvents, the adsorbed

aggregates in toluene evolved dynamically and formed a looser structure than in heptane. Force
 measurement by AFM and SFA [11–16,18,69] also suggested that the asphaltene film on mica
 swelled more significantly in toluene than in heptane.

604 It is worth mentioning that the different conformations of asphaltene aggregates reported on 605 similar solid-liquid interfaces can be attributed to the molecular structure of asphaltene. For 606 example, compared with the deprotonated C5Pe in this work, direct adsorption of VO-79 (PAH 607 with two C₇H₁₅ side chains) on mica in toluene [26] was found to favor a flat configuration. For 608 the charge neutral VO-79, Coulombic repulsion from the surface would decrease. Therefore, the 609 first PMF minimum in Figure 4b would be deeper if the deprotonated C5Pe was replaced with 610 VO-79, giving rise to more parallel alignment between the molecule and the surface. On the other 611 hand, Xiong et al. [70] reported that in toluene tilted configuration on mica (with hydroxyl groups) 612 was enhanced for the adsorption of neutral C5Pe, compared with the deprotonated C5Pe. As shown 613 in Figure 4b, the second energy minimum near the alumina surface in toluene corresponded to the 614 formation of H-bonds and tilted configuration of deprotonated C5Pe. Different from the 615 deprotonated C5Pe which can only serve as H-bond acceptor, the neutral C5Pe could serve as both 616 H-bond donor and acceptor, enhancing the H-bonding with the surface. As a result, the second 617 energy minimum in Figure 4b would be deeper and lead to increased occurrence of tilted 618 configuration. Finally, real asphaltene is a complex mixture and its composing molecules can contain other heteroatoms such as N, S and metal atoms. The COO⁻ group in the model asphaltene 619 620 (C5Pe) employed in this work mainly drives the H-bonding with the alumina surface of Kaol. 621 There have been several reports on the role of other heteroatoms in the interaction between 622 asphaltene and solid surfaces [19,20]. For example, MD simulation by Bai et al. [19] reported that 623 the presence of heteroatoms (N, S, and O) promoted the asphaltene-silica interactions, with S

contributing the most in enhancing the van der Waals interaction. N, S, and O could also form Hbonds with the silica surface when present on the asphaltene side chain. To date, the role of metal atoms such as Ni and V have been rarely studied. In the work of Hao et al. [21] regarding metal adsorption on clay minerals, Ni or V could substitute Si or Al atoms and form chemical bonds with the oxygen atoms of the clay minerals. It can then be hypothesized that the presence of metal atoms might promote the interactions with the surface oxygen atoms and enhance the adsorption. Future simulations can be performed, preferably with a reactive force field, to investigate this conjecture.

631 **4. Conclusion**

632 Adsorption of amphiphilic C5Pe monomer from water onto two types of model surfaces of 633 planes of kaolinite showed different characteristics depending on the polarity of the surface. 634 Adsorption on the alumina (hydrophilic) surface was enthalpy driven, while on the siloxane 635 surface was mainly driven by entropy. In organic solvents, toluene, and heptane, the monomer 636 adsorption on both types of surfaces was driven by enthalpy including van der Waals, H-bonding, and in the case of heptane, Ca²⁺ coordination. In toluene, the adsorption was preferable on the 637 638 alumina surface whereas in heptane, the strength of adsorption is comparable on alumina and 639 siloxane surfaces. Multiple C5Pe molecules formed aggregates in the three types of solvents, 640 driven by π - π interaction, and aided by Ca²⁺ coordination in organic solvents. The adsorption in 641 water was hardly affected by the aggregation, but an interplay between adsorption and aggregation 642 existed in toluene and heptane. To the best of our knowledge, this is the first theoretical report on 643 the adsorption of asphaltene between surfaces of varying polarity, and the mechanistic insights 644 revealed in this work can provide theoretical guidance to multiple applications in the petroleum 645 industry, such as EOR, oil transportation, and tailings treatment.

646 Supporting Information

647	S1 .	Additional	results

648 S2. Calculation details

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