1	Understanding model crude oil component interactions on
2	kaolinite silicate and aluminol surfaces: towards improved
3	understanding of shale oil recovery
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25 **ABSTRACT:** Shale oil is currently of interest for unconventional resource exploration 26 and development. Understanding the mechanism of interaction between the complex 27 mixture of organic compounds in shale oil and minerals making up the reservoir rock-28 oil interface will assist recovery. In this study, molecular dynamics simulation is used 29 to study the adsorption characteristics of a model oil mixture within nanoscale intra-30 particle pores of kaolinite minerals, which form pore filling structures in shale rock. To 31 better understand the effects of oil composition, temperature and pressure on the 32 adsorption properties of the model oil mixture, a range of temperatures (298 K, 323 K, 33 348 K and 373 K) and pressures (1 bar, 50 bar, 100 bar and 200 bar) representing up to 34 reservoir conditions were used. This study shows that adsorption and arrangement of 35 oil molecules is dependent on the surface of kaolinite and the distance away from it. 36 The simulations show polar compounds are likely to be adsorbed on aluminol kaolinite 37 basal surfaces, while alkanes preferentially adsorb on silicate surfaces. In addition, the 38 number of oil molecule bound layers, and total adsorption amount on the silicate surface 39 is greater than the aluminol surface. The density of adsorbed oil is reduced with increase in temperature, while the effect of pressure is not as significant. On the basis of 40 41 performed molecular simulations, we show the adsorption rate of shale oil on the 42 surfaces of kaolinite sheets and assess the removable capacity of the model oil.

43 **Keywords:** shale oil, molecular dynamics, clay mineral, recovery.

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## 44 **1. INTRODUCTION**

With increasing demand for energy, and while conventional oil and gas resources are 45 46 depleting, unconventional oil and gas are receiving more attention as they have become a major contributor to sustained growth in global hydrocarbon production. The 47 48 exploration and development of shale gas has achieved notable success in North America,<sup>1-3</sup> and led a global shale gas research boom.<sup>4,5</sup> However, with the lessons 49 learned from initial phases of shale gas extraction and the decrease of natural gas price, 50 investors have now shifted their attention to more profitable shale oil.<sup>6-8</sup> According to 51 the Energy Information Administration,<sup>9</sup> in the last 10 years, the production of U.S. 52 53 shale oil has increased 12.2 times to an average of 4.57 million barrels per day 54 (MMbbl/d) in 2015, compared to 0.37 MMbbl/d in 2005. Driven by the exploitation of tight sand formations, the United States remained the world's top producer of petroleum 55 and natural gas hydrocarbons in 2015.<sup>10</sup> Shale oil is playing a significant role in the 56 global energy industry, and a worldwide shale-oil boom is predicted.<sup>11-13</sup> 57

Preliminary evaluation has shown that shale oil resources are very rich in China, 58 59 with the amount of geological resources put at 32 billion barrels, and China ranked third among the 41 countries which have an accumulated total shale oil resource of 345 60 billion barrels.<sup>14</sup> At present, in China, a number of reserves in which the amount of 61 geological resources are between  $3.5 \times 10^9$  barrels and  $7 \times 10^9$  barrels have been 62 discovered, for example in the Triassic Yanchang Formation of the Erdos Basin, 63 64 Permian Lucaogou Formation of the Junggar Basin, and the Qingshankou Formation of the Songliao Basin. There are also many important discoveries in the lime-shale of 65 Bohai Bay area and in the Sichuan Basin.<sup>15,16</sup> Compared with marine shale oil in the 66

67 North America, the lacustrine shale oil in China is heavier and has higher amounts of 68 polar components; resin and asphaltene is much more abundant than in the North 69 America reservoirs. The presence of these components in the lacustrine shale oil is 70 thought to result in stronger adsorption of oil within the pores of the shale system, which 71 requires extra effort to remove and makes the reservoir more difficult to develop. These 72 polar components should be accounted for in the assessment of shale oil production in China, as they strongly interact with kerogen, minerals, and the widespread nanopores 73 in the shale rock,<sup>17-19</sup> leading to errors in recoverable resource estimation. 74

75 The adsorption of alkanes on carbonaceous materials, akin to the kerogen, has been studied in recent years. McGonigal et al. directly imaged a two-dimensional, high-76 77 degree ordering of the alkane laver at the liquid/graphite interface using a scanning tunneling microscope (STM).<sup>20</sup> Castro et al. reported that longer alkanes show a strong 78 preference for adsorption onto graphite.<sup>21</sup> Furthermore, Severson and Snurr studied the 79 adsorption isotherms of linear alkanes (ethane, pentane, decane, and pentadecane) on 80 81 activated carbon and evaluated the functions of pore size, chain length, and temperature on adsorption.<sup>22</sup> Recently, Harrison et al. studied the single component preferential 82 83 adsorption of linear and branched alkanes in pores with different apertures (1, 2, and 4 nm) at 390 K.23 84

A similar issue of accounting for hydrocarbons trapped in narrow pores for shale gas has been discussed by Ambrose et al., who suggested that an adjustment of adsorption phase volume is necessary for gas-in-place (GIP) calculations, leading to a 10 to 25% decrease in GIP in comparison with the conventional method for assessment.<sup>24-26</sup> In addition, Wang reported that the unrecoverable fraction of oil-inplace (OIP) is 13% in Bakken shale,<sup>27</sup> when taking the adsorption of alkanes in a graphite model into consideration. Nevertheless, there are relatively few studies that
explore the effect of polar component adsorption on the estimation of shale oil-in-place.

93 While the interaction of hydrocarbon molecules with pores and surfaces coated with 94 kerogen like materials has been more extensively studied, conceptually shale consists 95 of two parts: organic matter (kerogen) and inorganic matter (minerals). The inorganic 96 part of shale mainly contains quartz, calcite, feldspar and clay minerals. Each kind of 97 mineral makes up a certain volume fraction of a lacustrine/marine shale and plays an 98 important role in shale systems through presenting intra- and inter-particle pore 99 networks that may hold hydrocarbons. Studying the interface of inorganic pores with 100 oil is challenging, and computational chemistry simulations offer great potential to 101 examine the properties of mineral interfaces and oil mixtures at an atomistic level. 102 Previous simulation studies of mineral-organic interfaces have been widespread and extensively studied in the past, such as quartz,<sup>28-30</sup> calcite,<sup>31</sup> montmorillonite,<sup>32</sup> 103 kaolinite,<sup>33</sup> and muscovite.<sup>34</sup> 104

105 Kaolinite often forms surface coatings in the inorganic pores of shale reservoirs, as 106 well as forming pore filling aggregates and presents inter-particle and intra-particle 107 pore surfaces. Kaolinite is different from certain other clay minerals such as illite, 108 smectite, and chlorite due to the octahedral-tetrahedral structure presenting two 109 different surfaces, the mainly oil-wetting silicate surface and the water-wetting aluminol surface. A significant number of computational studies have been published 110 on kaolinite surfaces,<sup>33,35-44</sup> but these have primarily focused on the adsorption 111 112 mechanisms of either a single molecule, or a relatively small number of organic 113 molecules to the mineral. As shale oil contains different types and molecular weight 114 alkanes, aromatic hydrocarbons and polar compounds, it is important to study the

adsorption of different alkanes in the presence of aromatic and polar compounds to build up a more complete picture of the mineral-oil interface. In addition, temperature and pressure change with depth and maturity in a shale reservoir, therefore it is also important to take these into consideration when considering shale oil adsorption.

119 In this present study, the adsorption behavior of a simple 6-component model crude 120 oil mixture on kaolinite basal surfaces (to represent a shale component) was studied 121 under reservoir conditions using molecular dynamics (MD) simulations. The main objectives were: (1) to provide nanoscale molecular-level resolution for studying the 122 123 interactions at the hydrocarbon-shale interface; (2) to accurately characterize the 124 adsorption properties of alkanes/polar compounds in the mineral slit-shaped pore space under different temperatures and pressures; (3) to provide improved parameters for the 125 126 calculation of the unrecoverable fraction for shale OIP (oil-in-place) estimation.

## 127 2. MODELS AND SIMULATION DETAILS

128 The kaolinite unit cell has the chemical formula Al<sub>2</sub>Si<sub>2</sub>O<sub>5</sub>(OH)<sub>4</sub>, without isomorphic 129 substitutions. The initial atomic positions were taken from the AMCSD (American Mineralogist Crystal Structure Database).<sup>45,46</sup> This was converted to a cubic cell. The 130 131 model contained three periodically replicated sheets of kaolinite, creating a clay slab of 252 unit cells  $(12 \times 7 \times 3)$  as shown in Figure 1g, with dimensions of approximately 132  $6.2 \times 6.3 \times 1.9$  nm. The kaolinite structures initially occupied the region 0 < z < 1.9 nm in 133 134 all models, and the clay mineral position varied slightly over all timescales modelled. 135 Curtis et al. reported that a large number of nanoscale pores appeared when R<sub>o</sub> (reflectance of vitrinite, this reflects the maturity of the shale) is higher than 0.9%.<sup>47</sup> 136 Pores having a size under 20 nm play an important role in the shale systems,<sup>48</sup> and the 137

138 8 nm slit-shaped pore (or gallery) in the present model was built to represent these139 pores.

140 A mixture of methane (CH<sub>4</sub>), *n*-hexane (C<sub>6</sub>H<sub>14</sub>), *n*-dodecane (C<sub>12</sub>H<sub>26</sub>), *n*-octadecane 141  $(C_{18}H_{38})$ , naphthalene  $(C_{10}H_8)$ , octadecanoic acid  $(C_{18}H_{36}O_2)$  represented the oil mixture molecules in these simulations, (Figure 1a-f). The possible adsorption 142 143 mechanisms of fatty acids on aluminol surface have been previously studied in the 144 literature, which are mainly caused by hydrogen bonding and Van der Waals interaction in the anhydrous condition.<sup>49</sup> While classical molecular dynamics (MD) simulation is 145 146 a powerful technique for understanding the interface structure and dynamics on models 147 of sufficient size to obtain a reasonable degree of complexity, owing to the electronic 148 structure not being included, it cannot be used to predict reactivity. Studies have 149 previously been undertaken looking at reactions of fatty acids at clay mineral interfaces 150 using electronic structure calculations, but on far smaller and less complex model systems.<sup>50</sup> Classical MD can be used to simulate the formation of pre-reactions 151 152 configurations and give an indicator of potential reactivity, however this was not undertaken for the present work.<sup>51</sup> 153

154 In order to compare the adsorption characteristics of multiple components, one 155 hundred and fifty organic molecules were loaded for each component in the models, with the initial percentage of each component at 16.67% by number. Methane 156 molecules were used to represent gas dissolved in the shale oil (C1-C5 fraction), n-157 158 hexane and *n*-dodecane molecules for the low carbon number alkanes ( $C_6$ - $C_{14}$  saturated hydrocarbon), *n*-octadecane molecules for high carbon number alkanes (C<sub>15+</sub> saturated 159 hydrocarbon), naphthalene molecules for aromatic hydrocarbons ( $C_{6+}$  aromatic 160 hydrocarbon) and octadecanoic acid molecules for polar compounds (resin and 161

asphaltene). The adsorbed molecules were inserted using the program PackMol,<sup>52</sup>
resulting in the system presented in Figure 1h.

The ClayFF force field and the CHARMM36/CGenFF force field were used to 164 165 model the kaolinite clay mineral basal surfaces, and the organic oil molecules respectively within the simulations.<sup>53-56</sup> Both of these two force fields have recently 166 been tested in conjunction, and the interacting properties between hydrated mineral 167 168 surfaces and organic molecules can be accurately reproduced using ClayFF and CHARMM36/CGenFF force field.<sup>57</sup> Previous simulations have shown that the 169 170 adsorption of organic molecules (which were parameterized with CHARMM/CGenFF) 171 on quartz surfaces (which were parameterized with ClayFF) are not only consistent with *ab-initio* molecular dynamics, but also with experimental X-ray reflectivity data.<sup>58</sup> 172 173 Intermolecular organic-clay mineral interactions were modelled using Lorentz-174 Berthelot mixing rules.

All simulations were performed using the MD suite, GROMACS 4.6.7.<sup>59, 60</sup> Real-175 space particle-mesh-Ewald (PME) electrostatics and a van der Waals cutoff of 1.4 nm 176 177 were used in all simulations. The parameters used in energy minimization and equilibration period were the same as Underwood et al.<sup>33</sup> This equilibration simulation 178 179 was followed by a 200 ns production run in the NPT ensemble using a velocity-rescale 180 thermostat, with a temperature coupling constant of 1 ps, and a semi-isotropic 181 Parrinello-Rahman barostat, with a pressure coupling constant of 1 ps. The simulations 182 were run under several conditions: 1) a pressure of 100 bar and a temperature of 323 183 K, which represents the geological conditions of the Nenjiang Formation in Songliao Basin,<sup>61</sup> and 2) three more temperature points (298 K, 348 K and 373 K at 100 bar) and 184 185 three more pressure points (1 bar, 50 bar and 200 bar at 348 K) were set in order to

186 study the influence of temperature and pressure on the oil adsorption, for the 187 temperatures and pressures reflect the main distribution of the oil-window stage in the 188 Nenjiang Formation.



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Figure 1. The molecules in the oil mixture: (a) methane (CH<sub>4</sub>), (b) *n*-hexane (C<sub>6</sub>H<sub>14</sub>), (c) *n*-dodecane (C<sub>12</sub>H<sub>26</sub>), (d) *n*-octadecane (C<sub>18</sub>H<sub>38</sub>), (e) naphthalene (C<sub>10</sub>H<sub>8</sub>), (f) octadecanoic acid (C<sub>18</sub>H<sub>36</sub>O<sub>2</sub>), (g) kaolinite surfaces, and (h) starting configuration of oil mixture in the kaolinite nanopore.

All simulation trajectories have been captured using VMD 1.9.2.62 The color 193 scheme of all snapshots is defined as follows. The clay structure contains silicon 194 195 (yellow), oxygen (red), aluminum (pink), and hydrogen (white) atoms. Organic molecules contain carbon (cyan), hydrogen (white) and oxygen (red). The 196 197 atomic/molecular densities of the oil mixture across the nanopore were calculated using 198 the analysis tools within GROMACS 4.6.7, and subsequently plotted using Matlab 199 2017. Owing to some of the simulations only reaching equilibrium at 140 ns (see determination of equilibrium in ESI), in order to increase the statistics of the 200

simulations, the simulation time was extended to 200 ns, and the last 60 ns was selected
to calculate the density profiles and undertake analysis of oil partitioning. Full details
of the analysis of the model oil partitioning are given in the ESI.

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# **3. RESULTS AND DISCUSSION**

### **3.1 Volume and density of adsorption of oil phase molecules.**

206 To gain insight into the adsorption behavior of the six-component oil mixture molecules 207 confined in the kaolinite nanopore, which consists of opposing silicate and aluminol 208 surfaces, local density distributions and configurations of different components after 209 equilibration were collected for oil mixtures within a 7.82 nm interlayer (representing 210 the nanopore space between the kaolinite sheets) at 323 K, 100 bar (Figure 2). The 211 continuous mass density profile (collected by partitioning the simulation box into layers 212 of 0.015 nm) normal to the kaolinite surface was calculated using the final 60 ns of 213 simulation data and the last frame of the production model was captured as a snapshot 214 to show the oil mixture distribution in region between the kaolinite sheets (Figure 2a). 215 Figure 2b shows that the oil mixture molecules are not uniformly distributed throughout 216 the slit-shaped pore, and the density is not symmetrical about the center line of the two 217 interfaces. Owing to the strong intermolecular affinities between the kaolinite mineral 218 sheets and the alkanes, increased order of the oil components through layering is 219 evident in the mass density near the mineral interface, and the magnitude of the ordered 220 arrangement gradually reduces with increasing distance from the aluminol and silicate 221 surfaces, which varies depending on the nature of the molecule. In the bulk region, the 222 computed mass density remains almost constant. The first density peak adjacent to the aluminol surface is 1887 kg/m<sup>3</sup>, which is approximately 1.5 times greater than that of 223

224 the bulk fluid (764 kg/m<sup>3</sup>); on the opposite side, the first density peak adjacent to the silicate surface is 3404 kg/m<sup>3</sup>, which is approximately 3.5 times greater than that of the 225 bulk fluid. Such high density is due to the increased order in the close packed 2-226 dimension layers, making it into a relatively immobile solid-like state.<sup>27,63</sup> Away from 227 the kaolinite interface region, surface induced structuring contributes a diminishing 228 influence on the mass density, thus leading to a lower density peak of 999 kg/m<sup>3</sup> on the 229 aluminol surface and 2519 kg/m<sup>3</sup> on the silicate surface. In the slit-shaped pore mid-230 plane, the physical properties of the bulk fluid show no strong fluctuations. 231

232 With the objective of determining an improved estimate of the recoverable oil-in-233 place, the volume occupied by the adsorption phase, which exists in a solid-like state, 234 must be determined and deducted from the total pore space. The mass density profiles 235 of the oil mixture in the kaolinite model (Figure 2a and 2b) reveal the adsorption region, defined as the region in which their local density deviates from the bulk value.<sup>64-66</sup> 236 237 Recent studies of liquid structure theory modelling for non-attractive hard spheres also 238 show pronounced oscillations in the density close to a boundary surface, with 239 Davidchack et al. showing these oscillations are caused by the surface providing a translational plane, rather than the molecules adhering to the surface.<sup>67</sup> Although 240 241 density oscillations are found in liquid structure models with no attractive potential 242 between the surface and the molecules, the average density of the "oscillation" region 243 at the boundary is almost the same as that in the bulk region. The average density of 244 each adsorption layer was also calculated for the kaolinite pore and analyzed (eq S1). The result shows that average density of oil mixture in the adsorption region is 245 246 significantly greater than that in the bulk region (Figure 2b), evidencing adsorption on the surface. The oil mixture contains four adsorption layers on the aluminol surface and 247

248 seven on the silicate surface, indicating differential multi-layer adsorption of oil mixture molecules on the surface of kaolinite sheets. The solvation forces between *n*-249 alkanes and mica surfaces, measured by Christenson et al.,<sup>68</sup> showed decaying layered 250 structuring, and the interlayer spacing observed (0.40-0.50 nm) was approximately 251 equal to the width of alkane molecules, while independent of the chain length (1.35 nm 252 253 for *n*-octane). Our analysis shows that the layer thickness is  $\sim 0.44$  nm on the aluminol surface and ~0.42 nm on the silicate surface (Figure 2b), in good agreement with the 254 255 above experimental results. Figure 2b also shows that the fluctuation of mass density 256 extends 1.77 nm and 2.96 nm for the aluminol surface and silicate surfaces, 257 respectively, suggesting that, under these conditions, and for a 7.82 nm pore with 258 kaolinite surfaces, the adsorbed hydrocarbon phase accounts for 60.4% of the pore 259 volume. The adsorption phase mass transfer ratio (eq S2) in the 8 nm kaolinite mineral pore is 65.7 % in the kaolinite pore. The  $C_{ada-a}$  and  $C_{ads-a}$  of the aluminol and silicate 260 surfaces are, respectively, 1.44 mg/m<sup>2</sup> and 2.47 mg/m<sup>2</sup> (Through eq S3 and eq S4). For 261 262 the model oil studied, the adsorption capacity of the silicate surface is much greater 263 than that of the aluminol surface.

264 Additionally, in order to investigate the oil mixture adsorption characteristics on kaolinite surfaces, in-plane cross-section images are taken to show the first and second 265 adsorption layer on both the aluminol and silicate surfaces (Figure 2c-f). In the first 266 267 adsorption layer on the aluminol mineral interface, octadecanoic acid and naphthalene occupy most of the surface area and are distributed with no apparent order (Figure 2c), 268 269 as in the second adsorption layer (Figure 2d). When compared to the aluminol surface, 270 on the silicate surface the octadecanoic acid and *n*-octadecane distribute in an ordered 271 manner, with a  $30^{\circ}$  angle between the *n*-octadecane molecules long axis and the

272 crystallographic y direction, shown as a blue dashed line in Figure 2e, which is determined by the crystal lattice symmetry. As a comparison, Dirand, et al. found that 273 274 the distance between *n*-octadecane molecules between planes in the crystal structure of *n*-octadecane is 0.48 nm,<sup>69</sup> which is 0.03 nm larger than that observed here on the 275 silicate surface. This indicates that *n*-octadecane molecules arrange closer due to the 276 277 hexagonal lattice of the silicate side. However, the thickness in the crystallographic zdirection is 0.40 nm, which is 0.04 nm smaller than that on the silicate surface. That is 278 279 because the temperature in this simulation is 323 K, which is 30 K higher than the *n*-280 octadecane crystallization temperature. Even though the *n*-octadecane molecules are 281 attracted towards the silicate surface, temperature plays an important role in the 282 adsorption characteristics. The n-octadecane molecules formed in a more crystal-like 283 state, but still containing molecular gauche conformers and torsion of the chains of 284 alkanes. As such, the thickness of one adsorption layer is larger than the thickness of a similar layer of crystalline *n*-octadecane.<sup>69</sup> Small molecules (methane, *n*-hexane and 285 286 naphthalene) are arranged in the interstices formed between the regions occupied by *n*octadecane and octadecanoic acid. This suggests some molecular sized nanoporosity is 287 formed by imperfect packing of larger organic molecules on the mineral surface. The 288 289 model oil molecules in the second adsorption layer on the silicate surface are more 290 disordered than the first adsorption layer, as evidenced by the increased distance 291 between them and the silicate surface (Figure 2f).



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Figure 2. The adsorption of the 6-component oil mixture in a 7.82 nm kaolinite pore (323 K, 100 bar) showing: (a) Snapshot of the final frame of the simulation; (b) Mass density profiles across the pore; (c) Cross section snapshot showing the first adsorption layer on the aluminol surface; (d) Cross section snapshot showing the second adsorption layer on the aluminol surface; (e) Cross section snapshot showing the first adsorption layer on the silicate surface; (f) Cross section snapshot showing the second adsorption layer on the silicate surface; (f) Cross section snapshot showing the second adsorption layer on the silicate surface.

# 299 **3.2** Comparison of the adsorption characteristics of multiple

### 300 components on both surfaces of kaolinite

301 Here, the adsorption character and mole number density of each component in the six-302 component oil mixture on kaolinite surfaces are discussed. Firstly, a snapshot of the last 303 frame of oil mixture adsorption simulation is taken to show the qualitative evaluation 304 of each component adsorption character of the oil mixture in the kaolinite model 305 (Figure 3). Each component is displayed separately on Figure 3a to Figure 3f. We can 306 see from Figure 3a that methane is mainly distributed evenly in the kaolinite slit-shaped 307 pore. Figure 3b shows that *n*-hexane has little affinity for either surface of the kaolinite, 308 but is still evenly distributed throughout the slit-shaped pore. However, the long 309 alkanes, n-dodecane and n-octadecane, are more likely to be adsorbed on the silicate 310 surface (Figure 3c and 3d). The majority of the *n*-octadecane are observed on the silicate surface in the first adsorption layer. In contrast, naphthalene and octadecanoic acid have 311 312 a higher probability of being adsorbed on the aluminol surface. This is due to the 313 attractive forces between the conjugated  $\pi$ -system of naphthalene and the slightly 314 positively charged hydrogen atoms of the kaolinite aluminol surface, as well as the 315 polar interactions and hydrogen bonding between the carboxylate groups and the 316 hydroxyl groups for octadecanoic acid (Figure 3e and 3f).



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Figure 3. Snapshot showing the adsorption characteristics of each of the six oil components in a
7.82 nm kaolinite slit-shaped pore at 323 K and 100 bar: (a) methane; (b) *n*-hexane; (c) *n*-dodecane;
(d) *n*-octadecane; (e) naphthalene; (f) octadecanoic acid

321 Mole number density profiles of each component in the oil mixture were 322 calculated to evaluate the adsorption characteristics quantitatively using eq S9 (Figure 323 4a and 4b). The mole number density profile of methane shows four distinct adsorption 324 layers on the aluminol surface, and the first adsorption layer peak value is a little higher 325 than that of bulk (Figure 4a). The thickness of each monolayer is 0.42 nm, by which 326 the mole number density profile is determined. In contrast to the aluminol surface, the 327 mole number density profile of methane on the silicate surface shows seven distinct 328 adsorption layers, but most are lower than the pore center region (Figure 4b). This 329 phenomenon is not like the single component methane adsorption characteristics on the 330 Na-montmorillonite surface, which has only one major adsorption layer where the density value is almost 4 times greater than that of bulk methane,<sup>70</sup> owing to the 331 332 existence of the other oil components. The methane molecules are not only adsorbed on the mineral surface, but also become dissolved in the oil mixture. 333

334 The adsorption mole number density profiles of liquid hydrocarbons (n-hexane, ndodecane, n-octadecane) on the aluminol surface show that there are also four 335 336 adsorption layers (Figure 4a), as for methane. Also, the density values of the adsorption 337 layers are lower than in the bulk (slit-shaped pore middle) region, indicating that the 338 liquid hydrocarbons are less likely to adsorb on the aluminol surface. In contrast, there 339 are seven adsorption layers of liquid hydrocarbons on the silicate surface and the 340 density values are much higher than in the bulk region. This is especially the case for 341 the longer *n*-octadecane molecules, which occupy almost half of the first adsorption 342 layer's available surface area at the interface. Within the first four adsorption layers on 343 the silicate surface, which is the region most influenced by the kaolinite sheet, the 344 values of the mole number density profiles peaks were found to decrease with the 345 alkane chain length ( $\rho_{mol-C_6H_{14}} < \rho_{mol-C_{12}H_{26}} < \rho_{mol-C_{18}H_{38}}$ ), as shown in Figure 4b.

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The aromatic hydrocarbon (naphthalene), mainly adsorbs directly onto the

347 aluminol surface, and not on the silicate surface, as indicated by a single prominent near surface peak in the density profile at the aluminol interface (Figure 4a), with a value of 348 349  $6.20 \text{ kmol/m}^3$  which is over 6 times greater than the bulk density (0.87 kmol/m<sup>3</sup>). Although there are seven adsorption layers on the silicate surface, the density values of 350 351 each are much lower than that of the bulk (Figure 4b), which is in accord with the 352 snapshot showing the adsorption characteristics of the individual component in Figure 353 3e. This indicates the naphthalene adsorption capacity on, and interactions with, the 354 aluminol surface are much higher than on the silicate surface.

355 The density profile for the adsorption of the polar octadecanoic acid (Figure 4a 356 and 4b) showed three adsorption layers on the aluminol surface and six layers on the 357 silicate surface. The density of octadecanoic acid in the bulk region is the lowest, 358 indicating octadecanoic acid is likely to be adsorbed the most, compared with the other oil components. There are two distinct peaks in the octadecanoic acid density in the 359 360 first adsorption layer on the aluminol surface, which is different from the other oil 361 components. The head group (carboxylate group) of the octadecanoic acid molecule is 362 adsorbed on the aluminol surface, with hydrogen bonding to the Al-OH groups partly suggested by the visual analysis, as can be observed in in Figure 3f. This results in the 363 hydrophobic alkyl chain orienting away from the surface. This can be contrasted with 364 the silicate interface, where the alkyl chain can be observed bonded on and parallel to 365 366 the kaolinite mineral surface, with the carboxylate head group oriented away from the surface. These results are consistent with the work of Underwood et al.<sup>33</sup> On the silicate 367 surface, the octadecanoic acid molecules are adsorbed with an almost parallel 368 369 orientation to the silicate surface, with a gauche conformation, similar to the n-370 octadecane molecules. The octadecanoic acid forms only one peak in the first adsorption layer, with five density peaks having values higher than that of the midplane (bulk) region and the density of the first layer is not higher than that of the second
layer, owing to the competitive adsorption of *n*-octadecane.

374 Additionally, in order to compare the adsorption characteristics of the six 375 components, the adsorption percentage of each individual component in the different 376 adsorption layers was calculated (eq S10). Mole number percentage of six components 377 on the aluminol side shows that naphthalene and octadecanoic acid occupy almost 85 % of first adsorption layer (Figure 5a). Both of these molecules follow the trend that 378 379 adsorption percentage decreases with the number of adsorption layers (this 380 phenomenon can be called a positive adsorption trend). However, the alkanes have a 381 contrary trend (this phenomenon can be called a negative adsorption trend), furthermore 382 the adsorption percentage of each component in the four adsorption layers decreases as 383 the carbon number increases.

384 On the silicate surface, *n*-octadecane has a trend that adsorption percentages 385 decrease with the number of adsorption layers, which is different from the trend on the 386 aluminol surface, indicating *n*-octadecane is more likely to be adsorbed on the silicate 387 surface (Figure 5b). Adsorption percentages of methane, *n*-hexane, *n*-dodecane increase 388 with the number of adsorption layers, the same trend as on the aluminol surface, 389 indicating they are less likely to be adsorbed on both surfaces of kaolinite compared 390 with the other three components. Naphthalene also has a negative adsorption trend on 391 the silicate surfaces, similar to methane, *n*-hexane, and *n*-dodecane, which is different 392 from the trend on the aluminol surface, and it indicates that naphthalene is likely to be 393 adsorbed preferentially on aluminol surfaces. Meanwhile, the adsorption percentage of 394 each liquid alkane component (n-hexane, n-dodecane, n-octadecane) in the first four 395 adsorption layers increases with increasing number of carbon atoms in the chain.

396 After comparing the adsorption character and mole number density profile of the 397 six components in the oil mixture on kaolinite surfaces, it can be concluded: 1) the 398 number of adsorption layers, density of each adsorption layer and total adsorption capability on the aluminol surface are all smaller than those on the silicate surface; 2) 399 400 the surface lattice structure of the silicate surface guides the arrangement of oil 401 molecules, whereas the aluminol surface does not; 3) aromatic naphthalene and polar 402 octadecanoic acid molecules are more likely adsorbed on the aluminol surface, while 403 *n*-octadecane molecules are more likely to be found adsorbed on the silicate surface. 404 Meanwhile, the percentage of alkane molecules in the adsorption layers on the silicate 405 surface increases as the number of carbon atoms increases; 4) alkanes have a negative 406 adsorption trend on aluminol surfaces, and naphthalene and octadecanoic acid have a positive adsorption trend; 5) the *n*-octadecane molecules have a positive adsorption 407 408 trend, meanwhile methane, n-hexane, n-dodecane and naphthalene have a negative 409 adsorption trend on the silicate surface. This partitioning is important as oil mixture components' adsorption characteristics play an important role in determining the 410 411 surface tension and nano-scale flow mechanism of the oil in the pores. Additionally, 412 this principle can also be applied to light hydrocarbon recovery in shale oil recovery 413 evaluation and enhanced oil recovery more generally.

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Figure 4. Analysis of the mole number density profiles of the six oil components on: (a) the aluminol surface; (b) the silicate surface.



418 Figure 5. Mole number percentage of the six oil components on (a) the aluminol surface. (b) the 419 silicate surface.

# 420 **3.3 Effect of pressure on oil mixture adsorption.**

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421 In this section, we discuss the influence of pressure on the adsorption characteristics of 422 the multiple oil components. Mass density profiles of the oil mixture at four different 423 pressure points (1 bar, 50 bar, 100 bar, 200 bar) are imaged on both sides of the kaolinite 424 slit-shaped pore (Figure 6a and 6b). Firstly, the thickness of the adsorption layer extends 425 very slightly with the increase of pressure. Meanwhile, as the pressure rises, the number of adsorption layers remains the same on both surfaces of the kaolinite sheets (four 426 427 layers on the aluminol surface and five layers on the silicate surface). In addition, the density of the oil mixture has small changes with pressure and the thickness of 428

adsorption layers decreases slightly with pressure on silicate surfaces. This is because
as the pressure increases, the force exerted on the system increases and this will lead to
closer packing of the oil molecules. Therefore, the density peak has a slight increase,
commensurate with a decrease in the thickness of the initial layer, though, overall,
pressure appears to have only a small effect.



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Figure 6. Mass density profiles for oil mixture at different pressures on kaolinite surface: (a) the aluminol surface; (b) the silicate surface.

#### 437 **3.4 Effect of temperature on 6-component oil mixture adsorption.**

In this section, the influence of temperature on the adsorption characteristics of the six 438 439 components of the oil mixture is studied. The mass densities at four different temperatures (298 K, 323 K, 348 K and 373 K) were plotted for both basal surfaces of 440 441 the kaolinite model (shown in Figure 7a and 7b). The mass density profiles start from the surface of the kaolinite sheets and end in the mid-point of the oil mixture where 442 443 more bulk like behavior is expected. Firstly, we can see that the lengths of the profiles 444 extend with the increase of temperature, i.e. the bulk density of the oil mixture decrease 445 with increased temperature. It can also be noted that, as the temperature rises, the 446 number of adsorption layers on the aluminol surface drops from six to three (six layers 447 at 298 K, 4 at 323 K, four at 348 K and three at 373 K), and on the silicate surface it drops from seven to five (seven layers at 298 K and 323 K, five at 348 K and 373 K). 448 449 Although the thickness of each adsorption layer increases with temperature, the mass

450 density, the total thickness of the adsorbed layer and the total adsorption capability have 451 different trends on the opposing sides of the kaolinite pore, with the silicate and 452 aluminol layers showing distinct behaviors. It is notable that each mass density peak 453 maxima of the adsorption layers moves further from the surface of the kaolinite with increased temperature (the position of second density peak maxima on the silicate 454 455 surface: 0.69 nm at 298 K; 0.69 nm at 323 K; 0.74 nm at 348 K; 0.78 nm at 373 K), with the exception of the first adsorption layer peak maxima (the position of first 456 density peak maxima on the silicate surface is almost 0.29 nm at all four temperature 457 458 points), where the change is negligible. This indicates that, independent of the 459 temperature, the arrangements of the oil mixture components and the mass center of the 460 first adsorption layer are almost the same, with small changes caused by the gauche 461 conformers and torsion of the chains of alkanes and octadecanoic acid. It can also be noticed that there is only single peak maxima in the first adsorption layer on the 462 463 aluminol surface at 323 K, which is different from the other three temperatures studied. 464 This arises due to the arrangement of octadecanoic acid molecules on the aluminol surface at 323 K being the same as that on the silicate surface, where the molecules are 465 466 adsorbed with in an almost parallel orientation to the aluminol surface, with a zigzag arrangement. 467

It is useful to compare the thickness of each adsorption layer on the silicate surface, at the four temperatures, with the inter-molecular plane packing thickness of *n*-octadecane in a crystalline state (293 K), which was measured by Dirand, et al.<sup>69</sup> The thickness of each adsorption layer at the four temperatures is 0.41 nm, 0.42 nm, 0.43 nm and 0.44 nm in the *z* direction for 298 K, 323 K, 348 K and 373 K, respectively. These are comparable to the 0.40 nm distances experimentally reported in crystalline 474 *n*-octadecane at 293 K. The slight (under 10%) increase of these values arises from: 1)
475 with the increase of temperature gauche conformations in the alkane chain are more
476 common, as well as appearance of rotatory states due to thermal motion of the
477 molecules; 2) the oil mixture in this simulation contains several small molecules (such
478 as methane, *n*-hexane) dissolved in the longer chain molecules, which will lead to the
479 increase of the adsorption layer thickness.



Figure 7. Mass density profiles for oil mixture at different temperatures on the kaolinite surface: (a)the aluminol surface; (b) the silicate surface.

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483 Additionally, in order to compare the adsorption characteristics of the six components at four temperatures quantitatively, the adsorption percentages of 484 485 individual component in a defined adsorption region on both sides of the kaolinite sheets was calculated through eq S11. Plot figures of the mole number percentage of 486 the six components on the aluminol interface show that naphthalene and octadecanoic 487 488 acid occupy almost 85% of space in the first adsorption layer. Figure 8a-c shows the 489 mole number percentage of alkanes (methane, *n*-hexane, *n*-dodecane and *n*-octadecane) 490 at the four different temperatures on the aluminol surface, the bulk region and on the 491 silicate surface, respectively. Figure 8e-f show the same data for naphthalene and octadecanoic acid, at four different temperatures on the aluminol surface, in the bulk 492 493 region and on the silicate surface, respectively. The black dashed line shows the initial 494 percentage of each component in the kaolinite model (i.e. 16.67 %). The mole number 495 percentage of alkanes in the adsorption region on the aluminol surface decrease with the rise in temperature, and they are all lower than the initial percentage, which 496 497 indicates that alkanes are not likely to be adsorbed on the aluminol surface. At lower 498 temperature (298 K) the percentages of alkanes are almost the same as one another, and, as such, very near to the initial percentage, however, with the increase of 499 500 temperature, the percentages of alkanes with a high carbon number in the interfacial 501 region decrease faster than those alkanes with a low carbon number. At 373 K, the 502 percentages of the alkanes are separated by the largest amount relative to each other. 503 The order of percentages of alkanes on the aluminol surface is methane<*n*-hexane<*n*-504 dodecane<*n*-octadecane, which are 14.4%, 12.1%, 7.9% and 6.8%, respectively (Figure 505 8a). When the percentage of octadecanoic acid on the aluminol side is considered, it 506 has a regular linear growth trend with the increase in temperature. However, the 507 naphthalene has a slightly decreasing trend. Furthermore, the percentages of both the 508 octadecanoic acid and naphthalene are higher than the initial (16.6%) percentage, which 509 indicate that they are more likely to be adsorbed on the aluminol surface than the 510 alkanes (Figure 8d) and octadecanoic acid has the biggest percentage in the adsorption 511 region on the aluminol side.

In this section, we discuss the adsorption percentage of six components on the silicate surface. Here, the alkanes have an opposite trend to that observed above on the aluminol surface, with increasing adsorption percentages as temperature increases. Alkanes with a high carbon number are adsorbed preferentially on the silicate surface than alkanes with a lower carbon number, which is again a different trend to that observed on the aluminol surface (Figure 8c). For the percentages of octadecanoic acid and naphthalene on the silicate side, octadecanoic acid decreases with increasing 519 temperature. Naphthalene shows a slight increase in adsorption with temperature 520 increase. Meanwhile, both molecules show relatively lower adsorbed amounts than the 521 initial percentage, which indicates that they are less likely to be adsorbed on the silicate 522 surface, especially at higher temperatures (Figure 8f).

523 Finally, we analyze the percentage of multiple components in the bulk region, 524 which also reflects the percentage of total adsorption capacity on the different basal 525 surfaces of the kaolinite sheets. At 298 K, the percentage of the alkanes with low carbon 526 number (methane and *n*-hexane) are higher in the bulk region than longer alkanes, 527 however, with increased temperature the percentages of alkanes begin to converge, 528 approaching the initial percentage. At 373 K, the order of alkane abundance in the bulk 529 region is methane< n-hexane< n-dodecane< n-octadecane, which are 17.7%, 18.4%, 530 18.8% and 19.2%, respectively (Figure 8b). This indicates that the alkanes with higher 531 carbon number are more likely to be adsorbed on both surfaces of the kaolinite sheets 532 at low temperature and become more mobile and release at high temperature. The 533 change in distribution percentage of naphthalene in the bulk has the same trend as that 534 of the alkanes with low carbon number and it is almost the same as the initial 535 percentage. This indicates that the percentage of naphthalene in the bulk region is the 536 same with that in the near-surface region. Percentage analysis of the octadecanoic acid shows it does not have a definite trend, though as they are all less than the initial 537 538 percentage this indicates that octadecanoic acid molecules are adsorbed more on the 539 surfaces, overall.





Figure 8. Mole number percentage of six components at different temperatures in kaolinite sheets
(a) alkanes on aluminol side; (b) alkanes in bulk region; (c) alkanes on silicate side; (d) naphthalene
and octadecanoic acid on aluminol side; (e) naphthalene and octadecanoic acid in bulk region; (f)
naphthalene and octadecanoic acid on silicate side.

# 545 **4. CONCLUSIONS**

546 In this work, we perform a study of the adsorption characteristics of a multi-component 547 oil mixture in a kaolinite nano-scale slit-shaped pore to represent intra-particle pores 548 within a shale oil system. We discuss the total adsorption phase thickness in the 549 nanopore and the characteristics of each component. The main conclusions of the study 550 are:

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(1) Under reservoir conditions (323 K, 100 bar), there are four distinct adsorption layers
of oil components on aluminol surfaces and seven layers on silicate surfaces, and
the thickness of each layer is 0.44 nm on the aluminol surface and 0.42 nm on the
silicate surface. In addition, the adsorption capacity per unit area of aluminol and
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silicate surface is  $1.44 \text{ mg/m}^2$  and  $2.47 \text{ mg/m}^2$  respectively. The silicate surface orders the arrangement of adsorbed molecules, and the adsorption capacity and density are higher than that of the aluminol surface.

(2) Naphthalene and octadecanoic acid are more likely to be adsorbed on the aluminol
surface, meanwhile, heavier hydrocarbons (*n*-octadecane) and octadecanoic acid
are more likely to be adsorbed on the silicate surface. With the increase of carbon
number, the adsorption percentages of the linear alkanes decrease in adsorption
layers. In addition, alkanes have a "negative adsorption trend" on aluminol surface,
while, naphthalene and octadecanoic acid have a "positive adsorption trend". In
contrast, the trend on silicate surfaces is opposite to that on aluminol surfaces.

565 (3) Pressure has little influence on the adsorption of the oil mixture. With the increase of temperature, the thickness, density of adsorption layer, number of adsorption 566 layers and total adsorption amount decreases on both surfaces of kaolinite sheets. 567 568 On the aluminol surface, the percentage of polar compounds increase, while the 569 presence of alkanes decreases with temperature. And at higher temperature (348 K and 373 K), the percentage of alkanes decrease with carbon number. However, these 570 571 trends on the silicate surface are opposite to those found on the aluminol surface. At lower temperatures enthalpy driven interactions are more important than 572 573 entropic ones. This explains the varying adsorption of oil components on different 574 kaolinite surfaces. At higher temperatures, entropy becomes more relevant, thus leading to reduction in surface selectivity. 575

576 The findings illustrate that in nano-pores in oil and gas reservoirs, layers of strongly 577 bound oil profoundly modify the available pore volume. Critically, the presence of

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different mineral surfaces can selectively remove different components of crude oil and 578 579 this is likely to be particularly important when considering oil migration pathways and, 580 especially, when considering surface wetness modification in enhanced oil recovery. 581 Given the recent increase in resolution in computer tomography and mineral/pore mapping capabilities,<sup>71</sup> this present study allows the properties of identified pores to be 582 583 further explored. Future work will explore the effect of pH and surface defects on the 584 surface adsorption characteristics of the model oil. Furthermore, the parameters 585 obtained here allow us to explore further recovery models for shale oil systems.

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# DECLARATIONS

Conflict of interest: We declare that we have no financial or personal relationships with other people or organizations that can inappropriately influence our work, there is no professional or other personal interest of any nature or kind in any product, service and/or company that could be construed as influencing the position presented in, or the review of, the manuscript entitled, "Understanding model crude oil component interactions on kaolinite silicate and aluminol surfaces: towards improved understanding of shale oil recovery".

Ethical approval: Not required

## **AUTHOR CONTRIBUTIONS**

Shansi Tian performed the molecular simulations and wrote the main manuscript. Valentina Erastova provided the Gromacs software training, the method for solving problems in the simulations and help to draft the manuscript. Shuangfang Lu defined (supervisor in China) the statement of problem. Chris Greenwell provide the main idea and help to draft the manuscript. Shuangfang Lu, Haitao Xue (vice supervisor in China), Chris Greenwell (supervisor in United Kingdom) designed and supervised the project. Tom Underwood help to discuss the main idea, provide the mineral model in the simulations and draft the manuscript. Fang Zeng, Guohui Chen, Chunzheng Wu and Rixin Zhao processed data and plotted figures. All authors reviewed the manuscript.

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