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# Molecular Dynamics Study on CO<sub>2</sub> Storage in Water-Filled Kerogen Nanopores in Shale Reservoirs: Effects of Kerogen Maturity and Pore Size

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**ABSTRACT:**  $CO_2$  sequestration in shale reservoirs is an economically viable option to alleviate carbon emission. Kerogen, a major component in the organic matter in shale, is associated with a large number of nanopores, which might be filled with water. However, the  $CO_2$  storage mechanism and capacity in water-filled kerogen nanopores are poorly understood. Therefore, in this work, we use molecular dynamics simulation to study the effects of kerogen maturity and pore size on  $CO_2$  storage mechanism and capacity in water-filled kerogen nanopores. Type II kerogen with different degrees of maturity (II-A, II-B, II-C, and II-D) is chosen, and three pore sizes (1, 2, and 4 nm) are designed. The results show that  $CO_2$  storage mechanisms are different in the 1 nm pore and the larger ones. In 1 nm kerogen pores, water is completely displaced by  $CO_2$  due to the strong interactions between kerogen and  $CO_2$  as well as among  $CO_2$ .  $CO_2$  storage capacity in 1 nm pores can be up to 1.5 times its bulk phase in a given volume. On the other hand, in 2 and 4 nm pores, while  $CO_2$  is dissolved in the middle of the pore (away from the kerogen surface), in the vicinity of the kerogen surface,  $CO_2$  can form nano-sized clusters. These  $CO_2$  clusters would enhance the overall  $CO_2$  storage capacity in the nanopores, while the enhancement becomes less significant as pore size increases. Kerogen maturity has minor influences on  $CO_2$  storage capacity. Type II-A (immature) kerogen has the lowest storage capacity because of its high heteroatom surface density, which can form hydrogen bonds with water and reduce the available  $CO_2$  storage evaluation in shale reservoirs.

# 1. INTRODUCTION

Since the industrial revolution, the concentration of carbon dioxide  $(CO_2)$  in the atmosphere has increased from ~280 ppm to the current level of ~410 ppm.<sup>1</sup> The excessive  $CO_2$  emission has caused serious climate concerns (e.g., global warming).<sup>2,3</sup> To reduce  $CO_2$  content in the atmosphere,  $CO_2$  capture and storage (CCS) in geological underground media becomes vitally important.<sup>2,3</sup> According to the Global Status of CCS (2019),<sup>4</sup> the majority of the sequestrated  $CO_2$  (~30 out of 37 million tonnes per year) is by means of  $CO_2$  enhanced oil recovery (EOR). On the other hand,  $CO_2$ -EOR is a promising method for shale exploitation after the primary recovery,<sup>5</sup> and the shale oil/gas production would continue to increase for the next few decades.<sup>6</sup> Therefore, compared with the plain  $CO_2$  geological sequestration,  $CO_2$  stored in shale reservoirs has a

huge potential and holds its distinct advantages.<sup>2,3,7</sup> First, from an economic perspective, the enhanced gas/oil production by  $CO_2$  injection can significantly offset the financial burden. In addition, the surface and underground facilities such as wells and pipelines are readily available to reduce the construction cost.<sup>2,3</sup> Second, from a technical perspective, the geological conditions of shale reservoirs have been sufficiently studied.<sup>2,3</sup>

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Shale reservoirs are typically associated with an organic content from 0.5 wt % to more than 10 wt %.<sup>8</sup> The organic matter (i.e., kerogen) in shale reservoirs contain a considerable number of nano-scale pores.<sup>9–13</sup> Type II kerogen is commonly seen in shale media (such as in Bakken formation and Eagle Ford formation).<sup>5,14</sup> Type II kerogen can be further divided into four sub-types (types II-A, II-B, II-C, and II-D) from low to high maturity as the atomic O/C and H/C ratios decrease.<sup>14–16</sup> On the other hand, during the development of shale reservoirs, there is a massive amount of water existing in the shale formations. The possible water sources include (1)connate water, which typically accounts for 10-30% of the pore volume;  $^{17,18}(2)$  hydraulic fracturing, in which a large amount of water is injected with only a small portion being recovered (e.g., only 7-22% of the injected fluid is recovered in the Marcellus formation<sup>19</sup>); and (3) water alternating gas flooding, in which massive amounts of water is injected into shale formations. While the traditional wisdom is that kerogen is hydrophobic and its hydrophobicity increases as maturity increases,<sup>20,21</sup> a few experimental and simulation studies have shown that water can be trapped in kerogen nanopores even for an over-matured kerogen.<sup>22-24</sup> As a result, it is probable that a considerable number of kerogen nanopores are filled with water.

In water-filled kerogen nanopores, the CO<sub>2</sub> storage mechanism and capacity are still unknown. For example, CO2 might exist in kerogen nanopores in the dissolved form.<sup>2,3,25</sup> It is observed that gas solubility in the solvent in nanopores differs from that in bulk due to the strong confinement effect.<sup>26</sup> There have been some studies on the  $\frac{27-45}{7}$  m gas solubility in the solvent in nano-scale pores.<sup>27-45</sup> They concluded that nano-confinements have significant impacts, either enhancing or reducing the gas solubility in the solvent depending on the confinement properties, pore size, as well as configurations of gas and solvent molecules and their size ratio, and so forth.<sup>26,34,38,42,44,45</sup> The enhanced and reduced gas solubilities are referred to as "over-solubility" and "undersolubility", respectively. The detailed review of the above works can be found in our recent work<sup>44</sup> and a recent review paper.<sup>26</sup> According to our recent works,<sup>44,46</sup> CO<sub>2</sub> solubility in water/brine in the kaolinite and silica nanopores strongly depends on the confinement surface chemistry. Therefore, CO<sub>2</sub> solubility in water in kerogen nanopores might be dependent on its maturity. In addition, Jin and Firoozabadi<sup>47</sup> reported that when the pore size is small, CO<sub>2</sub> can displace water in graphene nanopores which are in chemical equilibrium with an aqueous phase with CO<sub>2</sub> dissolved therein, while in larger pores, CO2 can only be adsorbed on the hydrophobic pore surface. Therefore, the coordinated effect of kerogen maturity and pore size should be explicitly explored, which determines the CO<sub>2</sub> storage form and capacity in the water-filled kerogen nanopores.

Therefore, in this work, we use molecular dynamics (MD) simulation to study the coordinated effect of kerogen maturity and pore size on  $CO_2$  storage mechanisms and capacity in water-filled kerogen nanopores. MD simulation is applied because it is challenging for experiments to investigate the underlying mechanisms in nanopores at an atomic scale and under high-temperature and high-pressure geological conditions.<sup>48</sup> We use type II kerogen with four different degrees of maturity (types II-A, II-B, II-C, and II-D<sup>14</sup>) associated with three pore sizes (1, 2, and 4 nm) to represent slit-shaped kerogen nanopores. While there have been studies on water

and CO<sub>2</sub> adsorption in the kerogen matrix,<sup>49–52</sup>we use slitshaped kerogen nanopores to study the structural properties of CO<sub>2</sub> and water as such a geometry is one of the most common pore shapes in kerogen.<sup>53</sup> The temperature and pressure are 353 K and 187.2  $\pm$  2.2 bar, respectively, which are the typical shale reservoir conditions.<sup>54,55</sup>

## 2. METHODS

In this section, we first describe the simulation setup, and then molecular models as well as the simulation details are introduced thereafter.

**2.1. Simulation Setup.** An example of the simulation setup is shown in Figure 1a. The center of the simulation box has water



**Figure 1.** Simulation system setup: (a) initial configuration of the simulation system, taking 2 nm nanopore and type II-A kerogen as an example and (b) morphology of the inner surfaces of the bottom matrices [see (a)] with their sizes in the x-y plane.

confined in a slit-shaped kerogen nanopore. On both ends of the pore, in the x-direction, two water slabs (serve as outside bulk water reservoirs) and two CO2 slabs (serve as injected CO2) are symmetrically placed. The kerogen molecules (types II-A, II-B, II-C, and II-D) are from Ungerer et al.,<sup>14</sup>who developed different kerogen models based on the experimental indexes, such as atomic ratios of H/C and O/C, aromatic carbon fraction, and heteroatom (N, O, and S) content. The procedure of constructing the kerogen matrices can be found in the "Kerogen Matrices Generation" part in the Supporting Information. The final morphology of the inner surfaces of the bottom matrices (see Figure 1a) with their sizes in the x-y plane is illustrated in Figure 1b. From type II-A to type II-D, the number of aromatic carbons on the pore surface gradually increases, while the number of hydrogen atoms gradually decreases. The morphology of the inner surfaces of the upper matrices (see Figure 1a) as presented in Figure S2 shows a similar phenomenon. The thicknesses of all the bottom and upper kerogen matrices are  $2.13 \pm 0.03$  nm in the z-direction. The pore size is denoted as the distance between the innermost atoms on the kerogen inner surfaces in the z-direction. Three pore sizes (1,2, and 4 nm) are designed to represent the kerogen nanopores, which are within the dominant pore size distribution in kerogen.  $^{13, \acute{5}6}$  CO $_2$ and water molecules can freely move in the system via molecular diffusion. Once the system reaches equilibrium (chemical potentials of water and CO<sub>2</sub> in the nanopore and bulk water reservoirs are equal<sup>43,44,46</sup>), the distributions of  $CO_2$  and water in the nanopore and bulk water reservoirs can be obtained in the corresponding regions. To minimize the pore end effect, we only use the center region of the

kerogen nanopore (6 nm in the center in the *x*-direction, marked as "analysis region" in Figure 1a) for analysis. The parameters of the system configurations are listed in Table 1. For the 4 nm pore cases,

# Table 1. Configuration Parameters of All the Simulation Systems a

parameter	pore size (nm)	kerogen type			
		II-A	II-B	II-C	II-D
bulk water thickness of each side, nm	1	~6.12	~6.08	~6.11	~5.93
	2	~6.12	~6.08	~6.11	~5.93
	4	~4.12	~4.08	~4.11	~3.93
bulk CO <sub>2</sub> thickness of each side, nm	1	~6.50	~6.50	~6.00	~6.50
	2	~6.50	~6.50	~6.00	~6.50
	4	~6.50	~6.50	~6.00	~6.50
total number of water molecules	1	13,708	13,985	13,993	14,140
	2	18,625	18,625	19,000	18,625
	4	20,000	20,000	20,600	20,000
total number of CO <sub>2</sub> molecules	1	4430	4270	4080	4380
	2	4740	4740	4420	4830
	4	6265	6275	5925	6345
pressure, bar	1	186.8	186.1	185.3	188.3
	2	189.1	187.6	187.2	186.8
	4	187.2	186.1	185.6	185.4

<sup>*a*</sup>The pressures are obtained by comparing the equilibrated bulk density of  $CO_2$  slab with NIST Chemistry Webbook.<sup>64</sup> The temperature for all the systems is 353 K, and the uncertainties of all the pressures are within  $\pm 0.3$  bar.

to reduce the computational cost, the thickness of the bulk water reservoirs in the *x*-direction is  $\sim$ 4 nm, which is smaller than that in other cases ( $\sim$ 6 nm). It is noted that the  $\sim$ 4 nm water slab is thick

enough to obtain the water bulk density and  $\mathrm{CO}_2$  solubility in bulk water.

2.2. Molecular Models. Water and CO<sub>2</sub> molecules are simulated by SPC/E<sup>57</sup> and EPM2<sup>58</sup> models, respectively. The Lennard-Jones (LJ) interaction between CO<sub>2</sub> and water molecules are adopted from Vlcek et al.,<sup>59</sup> who optimized the unlike-pair parameters. In our previous works,<sup>44,46</sup> we conducted a thorough validation of water and CO<sub>2</sub> force fields. It has been proven that the optimized SPC/E + EPM2<sup>59</sup> have excellent performances in terms of CO<sub>2</sub> bulk density, CO<sub>2</sub>-water interfacial tension, CO<sub>2</sub> solubility in bulk water, and CO<sub>2</sub> diffusion coefficient in bulk water. Therefore, in this work, we use the optimized SPC/E + EPM2<sup>59</sup> to describe water and CO<sub>2</sub>. The force field parameters can be found in Table S1 in Supporting Information. The kerogen matrices are described by the consistent valence force field (CVFF).<sup>60</sup> While the original force field used in Ungerer et al.<sup>14</sup> is polymer consistent force field extension (PCFF+), it is difficult to couple with other force fields such as SPC/E and EMP2. This is because PCFF+ uses LJ 9-6 to describe the repulsion and dispersion interactions, while SPC/E and EMP2 use LJ 12-6. On the other hand, CVFF is a good alternative, which has been widely used to model kerogen and its interactions with others (such as  $CO_2^{24,49,50}$  water,<sup>24,50</sup> and methane<sup>24,49,50</sup>). To further validate the CVFF force field, we calculate the densities of different kerogen matrices. The simulated densities (unit: g/cm3) of types II-A, II-B, II-C, and II-D are  $1.151 \pm 0.003$ ,  $1.147 \pm 0.003$ ,  $1.202 \pm 0.002$ , and  $1.359 \pm 0.003$ , respectively, at 353 K and 187 bar (conditions used in this work). Except for type II-B, whose density is not available in the literature, the corresponding experimental densities for types II-A, II-C, and II-D are 1.18-1.29, 1.18-1.25, and 1.30-1.40, respectively.<sup>14</sup> The good agreement between the simulated density and experimental data indicates the validity of the CVFF force field. To test whether water can imbibe into the kerogen nanopores, we set up a number of systems including a kerogen (from immature to over-mature) slit pore and two water slabs on both ends of the pore (see details in the "Water Imbibition into Kerogen Nanopores" part in Supporting Information). We note that water gradually imbibes into all the kerogen nanopores even in 1 nm pores. In addition, we also calculate the water contact angles in the water-vacuum-type II-D kerogen systems (see details in the "Water Contact Angle" part in Supporting Information). The water contact angles on the bottom and upper



Figure 2. Density profiles of water and  $CO_2$  normal to the kerogen surface in 4 nm slit pores at 353 K and 186.3 ± 1.2 bar. The bands with lighter colors represent the uncertainties of the corresponding density distributions.



Figure 3. Density profiles and orientation parameters of water and  $CO_2$  normal to the kerogen surfaces in 4 nm slit pores at 353 K and 186.3  $\pm$  1.2 bar. The bands with lighter colors represent the uncertainties of the corresponding distributions.

kerogen surfaces are consistent, which are  $43.2 \pm 3.2^{\circ}$ . Type II-D kerogen shows water-wet properties, which is consistent with the other simulation results<sup>24</sup> and experiments.<sup>22,23</sup> Therefore, we believe that CVFF can faithfully model the kerogen and can be coupled with water and CO<sub>2</sub> with a reasonable accuracy.

2.3. Simulation Details. All the simulation systems are assembled by PACKMOL package<sup>61</sup> and conducted by the GROMACS package (version 2019.5).<sup>62,63</sup> The systems are first relaxed by the steepest descent algorithm until the maximum force on any atom is less than 1000 kJ/(mol·nm), then followed by an NVT ensemble simulation with a 2 fs time step for equilibration. The equilibration time for each system varies, which is 200, 90, and 100 ns for the systems with pore size of 1, 2, and 4 nm, respectively. When both water and CO<sub>2</sub> density profiles in the nanopores and outside bulk water reservoirs are stable, we consider that the systems have reached equilibrium. Figures S6 and S7 present an example to determine the equilibrium. Then, a 20 ns NVT ensemble simulation for production is followed with a 2 fs time step for each system. The kerogen matrices are always fixed throughout the simulations. The trajectory in the production stage is saved every 200 time steps (400 fs); thus there are total 50,000 frames for data analysis in each system. Three dimensional (3-D) periodic boundary conditions are applied. System pressure is dictated by the density in the bulk CO<sub>2</sub> slabs as shown in Figure 1a from NIST Chemistry Web book<sup>64</sup> as the CO<sub>2</sub> model used can accurately reproduce its density in the studied pressure range.<sup>44,46</sup> The pressure for each system can be found in Table 1, which is in the range of 187.2  $\pm$  2.2 bar. The system temperature is controlled by a velocity rescaling thermostat<sup>65</sup> at 353 K. Except for the interaction between water and  $CO_{21}^{59}$  the LJ interaction between other unlike pairs further than three bonds or in different molecules is calculated by geometric average.<sup>16</sup> LJ potential is truncated at 1.2 nm with tail corrections.<sup>66</sup> The electrostatic interaction is addressed by the particle-mesh Ewald method.<sup>67</sup> Water and CO<sub>2</sub> molecules are rigid, which are achieved by the SETTLE algorithm<sup>68</sup> and by introducing two virtual atoms, respectively.

## 3. RESULTS AND DISCUSSION

In this section, we first present the kerogen maturity effect on water and  $CO_2$  distributions in 2 and/or 4 nm slit pores and then compare water and  $CO_2$  distributions in type II-B kerogen nanopores with different pore sizes to elaborate the

pore size effect. Thereafter,  $CO_2$  storage mechanisms and capacity in kerogen nanopores are discussed.

**3.1. Kerogen Maturity Effect.** Kerogen maturity effect is illustrated based on density profiles and molecular orientations normal to each kerogen surface, density contour maps parallel to each kerogen surface, and heteroatom and hydrogen bond (H-Bond) distributions on each kerogen surface.

3.1.1. Density Profiles Normal to the Kerogen Surface. Figure 2 depicts the number density distributions of oxygen and hydrogen atoms in water molecules (denoted as Ow and Hw, respectively) and carbon and oxygen atoms in CO<sub>2</sub> molecules (denoted as Cc and Oc, respectively) in 4 nm slit pores normal to the kerogen matrices. The data is extracted from the analysis regions in the slit pores (see Figure 1a) to minimize the pore end effect. Water (Hw and Ow) is generally depleted from the kerogen surface regardless of its maturity, while it is relatively less depleted on type II-A kerogen surfaces compared to others. On the other hand, CO2 is strongly adsorbed on the kerogen surfaces, forming a prominent adsorption layer on each surface of the pore, in line with previous simulation work.<sup>24</sup> While the CO<sub>2</sub> adsorption amount on the type II-A kerogen surface is relatively small, the adsorption amounts on the other three kerogen surfaces are comparable. Both water and CO<sub>2</sub> densities converge to their respective bulk values in the middle of the pores. In contrast to the pure water density distributions in the 4 nm pores (see Figure S4c), the water adsorption layer on the kerogen surface is displaced by  $CO_2$  when  $CO_2$  is injected. As shown in Figure S6,  $CO_2$  gradually accumulates on the kerogen surface, while water is gradually depleted.

In Figure 3, we present the density profiles of  $CO_2$  and water altogether in various 4 nm kerogen pores. In addition, we also present the orientation parameters of water and  $CO_2$  in Figure 3, which are given as<sup>70–73</sup>

$$S_z = 1.5 \times \left\langle \cos^2 \theta_z \right\rangle - 0.5 \tag{1}$$

where  $S_z$  represents the orientation parameter of water or CO<sub>2</sub>,  $\theta_z$  is the angle between the *z*-axis and molecular axis (the lines



**Figure 4.** 2-D density contour in the adsorption zone of Ow (first column) and Oc (middle column) parallel to the bottom kerogen surface in 2 nm pores as well as the kerogen surface roughness (third column) in type II-A (first row), type II-B (second row), type II-C (third row), and type II-D (fourth row) kerogen nanopores. The roughness shows the deviation from the average position. Red, green, and yellow circles are the positions of O, N, and S on the kerogen surface, respectively.

connecting two Hw for water and two Oc for  $CO_2$ , respectively, as shown in the schematic diagrams in Figure 3b), and  $\langle \cdots \rangle$  implies the ensemble average. Positive orientation parameters represent that the molecules are perpendicular to the kerogen surface (fully perpendicular to the surface at  $S_z = 1$ ); negative values mean that the molecules are parallel to the kerogen surface (fully parallel to the surface at  $S_z = -0.5$ ); and  $S_z = 0$  indicates a random orientation. We find that  $CO_2$  molecules present a parallel alignment near all the kerogen surfaces, whereas water forms a perpendicular orientation. Both water and  $CO_2$  are randomly distributed in the middle of the pore. The density profiles and orientation parameters in 1 and 2 nm kerogen pores are depicted in Figures S8–S11. The distributions and orientations of water and  $CO_2$  near the kerogen surfaces in 2 nm pores are similar to those in the 4 nm pores, while in the 1 nm pores,  $CO_2$  can completely displace water molecules. Only a negligible number of water molecules exist in the 1 nm pores, while  $CO_2$  can form layering structures. This phenomenon will be further discussed in Section 3.2.

3.1.2. 2-D Density Contour Parallel to Kerogen Surfaces. To have a better visualization of water and  $CO_2$  distributions near the kerogen surfaces, we depict 2-D density contour plots of Ow and Oc in the adsorption zone parallel to the kerogen surfaces (the x-y plane of 2 nm slit pores) as well as the roughness of the kerogen surfaces in Figure 4. The adsorption zone is defined from the first position where Oc density is 1.1 times of its bulk value (the average density in the middle of the



**Figure 5.** (a) Heteroatom surface density (sum of O, N, and S) as well as H-Bond surface densities between water and heteroatoms in various kerogen nanopores; (b) sorted heteroatom surface densities; (c) H-Bond surface densities between water and sorted heteroatoms; (d) H-Bond densities between water and sorted heteroatom per each heteroatom.  $\rho_{\text{H-Bond}}$  means the H-Bond between water and heteroatoms in the systems of H<sub>2</sub>O + CO<sub>2</sub> in the kerogen nanopores and  $\rho_{\text{H-Bond}}^*$  means the H-Bond between water and heteroatoms of pure H<sub>2</sub>O in the kerogen nanopore. All of the results are obtained in 2 nm slit pores.

pore) to the second one in the z-direction. The roughness is estimated by the method provided in the study of Düren et al.<sup>74</sup> by rolling a probe particle (with a diameter of 0.2 nm in this work) around the surface of each atom of the kerogen matrix. It shows that in all the kerogen types, water generally accumulates around the heteroatoms (i.e., O, N, and S) at the convex positions, especially O atoms, while it is less densely distributed in the areas where heteroatoms are absent or the concave parts of kerogen surfaces (see the black rectangles highlighted in Figure 4d,g, in which water is less densely distributed while CO<sub>2</sub> accumulates around the O atoms on the concave kerogen surfaces). On the other hand,  $CO_2$  strongly accumulates in the concave parts of kerogen surfaces and weakly accumulates on the convex areas where heteroatoms are absent, while it is generally depleted on the convex areas with the presence of heteroatoms. Overall, the planar  $CO_2$ distribution is mainly dependent on the surface roughness, while that of water is determined by both surface roughness and the presence of heteroatoms. It is also noted that the planar distributions of water and  $CO_2$  in the adsorption zone are similar in 4 nm pores.

3.1.3. Kerogen Surface Property Effect. To further understand the effect of various heteroatoms on water distribution, we present heteroatom surface density (# of heteroatoms per surface area), H-Bond surface densities (# of H-Bond per surface area), and H-Bond formation abilities (# of H-Bond per heteroatom) between water and heteroatoms in 2 nm pores in Figure 5. The heteroatom surface density is obtained by the number of heteroatoms on both bottom and upper surfaces (a thin slab with a thickness of 0.4 nm from the innermost atom of the kerogen toward the kerogen matrix in the z-direction. 0.4 nm is chosen as it is close to the diameters of the heteroatoms) in the analysis region (see Figure 1a) divided by the projected area of both the bottom and upper surfaces in the x-y plane. The H-Bond is determined when the donor-acceptor distance is less than 0.35 nm and the angle between the vectors of donor-H and H-acceptor is less than 30°.73 As depicted in Figure 5a, type II-A kerogen has the highest heteroatom surface density, followed by type II-D, type II-C, and type II-B. Interestingly, the heteroatom surface density does not monotonically decrease as kerogen maturity increases even though it is believed that the heteroatoms are gradually lost as kerogen evolves from low to high maturity.<sup>21</sup> This is understandable because, from type II-A to type II-D, while the overall trend is that the number of heteroatoms decreases per kerogen molecule (the experimental measurements indicate that the atomic ratios of heteroatoms and carbon for types II-A, II-B, II-C, and II-D are 0.140, 0.091, 0.077, and 0.078, respectively.<sup>14</sup> The above ratios of kerogen models in this work are 0.131, 0.091, 0.083, and 0.085, respectively, which are quite similar to the experimental data), the kerogen molecule becomes smaller (see kerogen molecular formula in Figure S1a). Therefore, to generate a given volume of the kerogen matrix, more kerogen molecules are needed as maturity increases (see "Kerogen Matrices Generation" part in Supporting Information), and the absolute number of heteroatoms in the high maturity kerogen matrices might be larger than that in the low maturity one. Likewise, the heteroatom density on the high maturity kerogen surface might also be higher than that on the low maturity one. In addition, H-Bond surface density between pure water and heteroatoms on type II-A kerogen surface is also the highest  $(\sim 1.9/nm^2)$ among the four kerogen types, while those for the other three kerogen types are comparable ( $\sim 1.0/\text{nm}^2$ ). As CO<sub>2</sub> is



Figure 6. Pore size effect on the density profiles of water and  $CO_2$  in type II-B kerogen nanopores. The horizontal axis is shifted to have all the middle points of the nanopores in the z-direction as the origin. The bands with lighter colors represent the uncertainties of the corresponding distributions.

adsorbed on the kerogen surfaces, the H-Bond densities between water and heteroatoms are only half of those when there is no  $CO_2$ . In Figure 5b, we sort the O and N atoms into several subgroups according to the functional groups shown in the inset of Figure 5b. The O atoms in ether, carbonyl, and hydroxyl groups are denoted as Oe, Oc, and Oh, respectively; the N atoms in pyrrole and pyridine groups are denoted as Nprl and Nprd, respectively; and S represents all the S atoms including those in sulfide, thiolane, and thiophene groups. Type II-A has the highest O surface density (summation of Oe, Oc, and Oh), especially for Oc and Oh, while type II-D only has Oe, which is the highest among these four kerogen types. In Figure 5c,d, we illustrate the H-Bond surface densities of different types of heteroatoms and the H-Bond number per heteroatom. The results indicate that O atoms (especially Oc and Oh) generally have the highest H-Bond surface density and formation ability. It is also in line with the fact that water tends to accumulate around O atoms on the kerogen surface (see Figure 4). In addition, water on type II-A kerogen surfaces is less depleted compared to others (see Figure 2), because type II-A kerogen with more Oc and Oh on its surfaces can form more H-Bonds than other kerogens.

**3.2.** Pore Size Effect and CO<sub>2</sub> Storage Mechanisms. To study the pore size effect, we present water and CO<sub>2</sub> density profiles along the z-direction in type II-B kerogen nanopores with various pore sizes in Figure 6. In 2 and 4 nm pores, water and CO<sub>2</sub> have similar distributions: water is depleted from the kerogen surface, where CO<sub>2</sub> is strongly adsorbed. This is also supported by the snapshots depicted in Figure 7b,c. Both water and CO<sub>2</sub> density distributions converge to (pseudo) bulk densities in the middle of the pore, and the molar fraction of CO<sub>2</sub> in the (pseudo) bulk region is identical to that in the outside bulk water reservoirs (see Figure 1a). In addition, the CO<sub>2</sub> and water orientations are random in the (pseudo) bulk region (see Figures 3 and



**Figure** 7. Snapshots of water and  $CO_2$  distribution in type II-B kerogen nanopores with various pore sizes. Panels (a-c) are shown in the x-z plane and panels (d-f) are shown in the x-y plane near the kerogen surface. The magenta and blue points represent  $CO_2$  and water, respectively.

S11). Therefore, the  $CO_2$  distribution in the middle of the pore is governed by the solubility mechanism in which  $CO_2$  is hydrated by water molecules. On the other hand, water and  $CO_2$  molecules near the kerogen surfaces in 2 and 4 nm pores, as depicted in Figure 7e,f, form their respective clusters. The density of  $CO_2$  near the kerogen surface is 1 order of magnitude higher than that in the (pseudo) bulk region in the middle of the pore. A similar result was also observed by the experiment and MD simulation.<sup>75</sup> The non-uniform distribu-

tion of water and CO<sub>2</sub> can be attributed to the presence of heteroatoms and surface roughness.<sup>75</sup> On the other hand, in the 1 nm pore, water is initially filled in the nanopores, but it is almost completely displaced by CO<sub>2</sub> after equilibration, and CO<sub>2</sub> can form layering structures as revealed in Figures 6 and 7a,d. A similar phenomenon is also reported by Jin and Firoozabadi,<sup>47</sup> where  $CO_2$  can displace water in 1 nm graphene pores. In small-sized pores, the confinement effect is relatively strong. The strong interactions between kerogen and CO<sub>2</sub> as well as among  $CO_2$  result in a gradual accumulation of  $CO_2$ molecules adsorbed on the kerogen surface and the depletion of water molecules. Thus, CO<sub>2</sub> storage in 1 nm kerogen pore is mainly by adsorption, which is different from that in 2 and 4 nm kerogen pores. The corresponding data for the other types of kerogen can be found in Figures S12-S14, which behave similarly to the type II-B kerogen.

**3.3. CO**<sub>2</sub> **Storage Capacity.** After the discussion of the effect of kerogen maturity and pore size on water and  $CO_2$  distributions and  $CO_2$  storage mechanisms, we evaluate the  $CO_2$  storage capacity  $S_{cap}$  in various kerogen nanopores, which is defined as

$$S_{\rm cap} = m_{\rm CO_2} / V_{\rm pore} \tag{2}$$

where  $m_{\rm CO_2}$  is the molar number of CO<sub>2</sub> molecules in the analysis region within nanopores (see Figure 1a) and  $V_{\rm pore}$  is the effective pore volume obtained from helium uptake method.<sup>44,46</sup> More details can be found in the "Effective Pore Volume" part in the Supporting Information.

In Figure 8, we present  $CO_2$  storage capacity in kerogen nanopores. For comparison,  $CO_2$  solubility in bulk water and



Figure 8. CO<sub>2</sub> storage capacity in all the systems.

CO<sub>2</sub> bulk density under the same conditions (353 K and 187.2  $\pm$  2.2 bar) are given as 0.98  $\pm$  0.02 and 12.76  $\pm$  0.15 mmol/  $cm^3$ , respectively. CO<sub>2</sub> solubility in bulk water is obtained from that in the outside bulk water reservoirs (see Figure 1a), which agrees well with experimental data.<sup>76</sup> Type II-A kerogen has the lowest storage capacity among the four types of kerogen due to its high content of heteroatoms on the surface, especially as Oc and Oh which can form strong H-Bonds with water. Thus, more water molecules are trapped in type II-A kerogen pores, while the available pore space for  $CO_2$  is reduced. However, the other three types of kerogen (types II-B, II-C, and II-D) have comparable CO<sub>2</sub> storage capacities. On the other hand, CO<sub>2</sub> storage capacity decreases as pore size increases. Nevertheless, CO2 storage capacity in the waterfilled kerogen nanopores in this work is always higher (at least 1.7 times) than that based on the  $CO_2$  solubility in bulk water.

In 1 nm kerogen pores,  $CO_2$  storage capacity is even higher than  $CO_2$  bulk density, reaching up to ~1.5 times of  $CO_2$  bulk density. These results suggest that the adsorption mechanism renders the highest  $CO_2$  storage capacity, followed by nanoscale  $CO_2$  clusters formed on the kerogen surface.<sup>75</sup> The solubility mechanism in bulk water has the lowest storage capacity in a given volume.

#### 4. CONCLUSIONS

In this work, we use MD simulation to study the effects of kerogen maturity and pore size on CO<sub>2</sub> storage mechanism and capacity in water-filled kerogen nanopores. We find that fluid distributions in 1 nm kerogen pores are different from those in larger pores. In the 1 nm kerogen pore, water is completely displaced by  $CO_2$ , while  $CO_2$  forms layering structures, due to the strong interactions between kerogen and  $CO_2$  as well as among  $CO_2$ . This leads to a high  $CO_2$  storage capacity in the 1 nm kerogen pores, which can be even more than 50% higher than  $CO_2$  bulk density. On the other hand, in the relatively larger pores (2 and 4 nm),  $CO_2$  is stored by the solubility mechanism in the middle of the pore. However, near the kerogen surface, CO<sub>2</sub> and water generally form their respective nano-clusters, due to the presence of heteroatoms and surface roughness. The aggregation of CO<sub>2</sub> molecules on the kerogen surface enhances the overall CO<sub>2</sub> storage capacity in kerogen pores. The increased storage capacity by  $CO_2$ clusters on the surface becomes less significant as pore size increases. The kerogen maturity also imposes a minor influence on CO<sub>2</sub> storage capacity. Type II-A kerogen has a relatively small CO<sub>2</sub> storage capacity compared with others due to its high Oc and Oh contents on its surface, which can form strong H-Bonds with water, thereby reducing the available space for CO<sub>2</sub>. The other three types of kerogen (types II-B, II-C, and II-D) have comparable CO<sub>2</sub> storage capacities. This work should provide some important insights into the CO<sub>2</sub> storage evaluation in the shale reservoirs and geological CO<sub>2</sub> sequestrations.

# ASSOCIATED CONTENT

#### Supporting Information

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acs.langmuir.0c03232.

Kerogen matrices generation; kerogen surface morphology; force field parameters; water imbibition into kerogen nanopores; water contact angle; equilibration check; kerogen maturity effect; pore size effect; and effective pore volume (PDF)

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#### Notes

The authors declare no competing financial interest.

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