# **CO2 Adsorption on Carbon Models of Organic Constituents of Gas Shale and Coal**

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Imperfections of the organic matrix in coal and gas shales are modeled using defective and defect-free graphene surfaces to represent the structural heterogeneity and related chemical nature of these complex systems. Based upon previous experimental investigations that have validated the stability and existence of defect sites in graphene, plane-wave electronic density functional theory (DFT) calculations have been performed to investigate the mechanisms of  $CO<sub>2</sub>$  adsorption. The interactions of  $CO<sub>2</sub>$  with different surfaces have been compared, and the physisorption energy of  $CO<sub>2</sub>$  on the defective graphene adsorption site with one carbon atom missing (monovacancy) is approximately 4 times as strong as that on a perfect defect-free graphene surface, specifically, with a physisorption energy of ∼210 meV on the monovacancy site compared to ~50 meV on a perfect graphene surface. The energy associated with the chemisorption of  $CO<sub>2</sub>$  on the monovacancy site is substantially stronger at ∼1.72 eV. Bader charge, density of states, and vibrational frequency estimations were also carried out and the results indicate that the  $CO<sub>2</sub>$  molecule binds to the surface becoming more stable upon physisorption onto the monovacancy site followed by the original  $C=0$ bonds weakening upon  $CO<sub>2</sub>$  chemisorption onto the vacancy site.

# **1. Introduction**

Annual carbon dioxide  $(CO<sub>2</sub>)$  emissions from fossil fuel combustion have been increasing exponentially compared to those in the preindustrial era. Globally, approximately 30.4 Gt of  $CO<sub>2</sub>$  were added to the atmosphere through the combustion of fossil fuels in 2008, which were almost twice as much as the average emitted throughout the 1970s. Within the U.S., fossil fuel combustion accounted for approximately 94% of CO2 emissions in 2008 (*1*). Worldwide economic stability and development require energy, which today is largely dominated by the direct combustion of fossil fuels. The total primary energy supply of the world doubled in the last 30 years due to the use of fossil fuels (*2*). With world energy supply (fossil fuels accounting for 81%) expected to rise by 52% between 2004 and 2030, global  $CO<sub>2</sub>$  emissions from energy generation is expected to reach 40.4 Gt  $CO<sub>2</sub>/$ year by 2030 under present policies (*3*). The Intergovernmental Panel on Climate Change (IPCC) indicates the need for an immediate  $50-70\%$  reduction in  $CO<sub>2</sub>$  emissions to stabilize global  $CO<sub>2</sub>$  concentrations at 1990 levels by 2100 (*4*).

Various studies are focused on the potential to capture and store CO<sub>2</sub>. After capturing directly from the industrial sources,  $CO<sub>2</sub>$  can be transported and injected into geologic formations to minimize global emissions. Different kinds of geologic formations have been proposed and investigated, including unmineable coalbeds, deep saline aquifers, depleted or depleting oil/gas reservoirs, etc., and each have different mechanisms associated with CO<sub>2</sub> storage (5). One advantage of storing  $CO<sub>2</sub>$  in coalbeds is that they are often close in proximity to electricity generation sources (e.g.,  $CO<sub>2</sub>$ ) point sources). Another advantage is that  $CO<sub>2</sub>$  injection into coalbeds enhances subsequent methane (CH4) recovery (*6*). Coalbed methane (CBM) represents more than 10% of technically recoverable natural gas in the U.S. (*7, 8*). The energy byproduct of enhanced coalbed methane production also assists in offsetting the high costs of  $CO<sub>2</sub>$  capture and storage (CCS), which could make it an economically viable option.

It is well accepted that coal in addition to the organic components of gas shales are extremely complex matrices comprised of molecular frameworks varying considerably in pore size, shape, and network. Previous studies provide indication that these systems are comprised of aromatic and aliphatic structures and/or other functional groups acting as bridges or comprising the chemical makeup of the pore surfaces (*9, 10*). The presence of volatile components such as water vapor, methane, and nitrogen- and sulfur-containing compounds is also expected. Indeed, these functional groups are expected to play a role in the adsorption mechanisms associated with CO<sub>2</sub> and methane on these systems depending on the local temperature and pressure. For instance, if the temperature and pressure conditions favor surface-bound water or various forms of dissociated water (e.g., hydroxyl or carbonyl groups at the carbon surface) at the surface this may lead to complex  $CO_2$ -water-surface interactions. Rather than  $CO<sub>2</sub>$  interacting directly with a surface, it may react indirectly via a shared proton. These types of investigations will reveal whether these functional groups will act to passivate or enhance the CO<sub>2</sub>-surface adsorption. Future work will involve the investigation of these indirect surface interactions, with the current work focusing specifically on CO2-surface interactions. Also, it has been reported that at the high pressures associated with sequestration that coal becomes  $CO<sub>2</sub>$  wet (11), thus providing support to the initial focus on  $CO<sub>2</sub>$ -surface interactions.

Using electronic structure theory to investigate  $CO<sub>2</sub>$ reactivity with defective carbon surfaces may also provide insight into the mechanism associated with the observed plasticization phenomena in ECBM operations. If the coal cleat fractures become restricted because of the coal plasticization, the gas permeability will be changed dramatically (*5, 9*). Electronic structure theoryis amolecular-scale analysis, and the understanding of the properties of the adsorbed phase of molecular  $CO<sub>2</sub>$  (as opposed to bulk) will assist in setting up models for the initial framework required to carry out statistical modeling such as Monte Carlo (MC). For instance, Grand Canonical MC has been successful at reproducing adsorption phenomena at the bench-scale (*12*). However, the agreement between the MC and experimental adsorption experiments often involve structurally and chemically homogeneous systems such as zeolites and metalorganic frameworks. With the chemistry of the organic matrix unknown in the current systems it is crucial that the initial

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models for MC are as representative of the chemistry as possible. For instance, existing models include the slit-pore model with a homogeneous surface of carbon atoms represented by a graphitic structure. Perhaps more realistic models for the complex Earth systems of focus in the current work are defective graphitic surfaces or surfaces with embedded functional groups.

Pore surfaces in coal were modeled previously by various idealized graphitic structures, including single-walled carbon nanotubes (SWNTs) and single graphene layers  $(13-17)$ . In addition to  $CO<sub>2</sub>$  storage in coalbeds, understanding gas interactions with defective organic surfaces is crucial for the estimation of initial natural gas in-place and production in gas shales. In most gas shales the organic fraction is less than 5%, and typical clay contents range from 30-50%, and the gas is likely to be adsorbed both within the micropores (<2 nm) of the organic fraction, in addition to the interlayer spacing of the clays (*18, 19*).

Within the complex heterogeneous structure of the organic matrices of coal and gas shales there likely exists a combination of defect sites and dangling bonds. Both the pore structure and surface reactivity will influence the mechanism associated with the  $CO<sub>2</sub>$ -surface interactions and subsequent storage potential. Defect sites are defined in this work as missing-atom sites while dangling bonds are in reference to edge sites. A defect site with a missing carbon atom will leave vacancies in which the carbon atoms at the vacancy are undercoordinated. To a certain extent the charge in this system will redistribute making these carbons slightly negative (possibly balanced by water existing in the local environment), differing from the chemistry and electronic structure of the edge sites, which do not have the influence of localized and symmetric undercoordinated carbon atoms. The focus of the current work will be on defect sites as a first step, whereas future work will investigate the reactivity of edge sites in addition to the influence of functional groups including oxygen, hydrogen, nitrogen, and sulfur atoms.

Although the adsorption of  $CO<sub>2</sub>$  on simplified graphitic surfaces has been experimentally and computationally investigated previously over the past several years (*20*-*31*), there are a limited number of theoretical studies that take chemical and structural heterogeneity into account. Xu et al. (*27*) investigated the different dissociative adsorption pathways of  $CO<sub>2</sub>$  on a perfect graphite (0001) surface using the first-principles-based B3LYP/6-31+G(d) hybrid density functional method. It was determined in this study that the two oxygen atoms of the  $CO<sub>2</sub>$  molecule each react differently with the surface, that is, one oxygen atom was reported to participate in forming an epoxy group, while the other formed either a gas-phase CO molecule (main reaction pathway) or a lactone group. The physisorption energy was reported to be ∼0.7 kcal/mol (∼30 meV), and the chemisorption energy of the main chemical reaction ∼96 kcal/mol (∼416 meV) after CO<sub>2</sub> overcomes a forward barrier of∼120 kcal/mol (∼520 meV). Density functional theory within the Perdew-Wang 91 (*32*) version of GGA was employed by Cabrera-Sanfelix  $(31)$  to investigate the adsorption of  $CO<sub>2</sub>$  on a defective graphene (0001) sheet with a single vacancy site. The physisorption energy was calculated to be ∼136 meV. Subsequently, chemisorption occurred after overcoming an energy barrier of about 1 eV relative to the gas phase, and a lactone group was formed with an exothermicity of about 1.4 eV. Carbon atoms of the graphene surfaces in this previous work were allowed to relax with the exception of a single carbon atom located at the edge of the small unit cell (4 × 4), which leads to an artificially induced contraction of the lattice during the geometry optimization, and subsequent asymmetric chemisorption of  $CO<sub>2</sub>$  onto the monovacancy site.

The objectives of this work were to apply plane-wave electronic density functional theory to gain a more accurate picture of the mechanism of  $CO<sub>2</sub>$  adsorption on defective graphene surfaces by investigating the effect of employing different unit-cell sizes with partial or full flexibility of surface carbon atoms, and also to obtain partial charge distribution of defective graphene surfaces to serve as an accurate framework for future work involving adsorption isotherm predictions using statistical-based methods.

## **2. Computational Methodology**

The Vienna *ab initio* simulation package (VASP) (*33, 34*) was used for all calculations and plane-wave electronic density functional theory (DFT) was employed due to its balanced computational efficiency and accuracy. The projector augmented wave (PAW) potential (*35, 36*) was used to describe the core-valence electron interaction of the carbon and oxygen atoms. The Perdew-Wang 1991 (PW91) version of the generalized gradient approximation (GGA) (*32*) was compared to other GGA methods and to the local density approximation (LDA).

An idealized carbon-based pore surface was represented using a graphene slab and a unit cell with periodic boundary conditions along three spatial directions. Previous investigations (*31, 37*) have confirmed that graphene is a sufficient system to model the  $CO<sub>2</sub>$ -surface interactions within a slit pore of a graphite framework due to the weak influence the neighboring carbon layers have on the adsorption energy. In the current work a vacuum region of 18 Å between periodic basal planes was used, along with  $5 \times 5 \times 1$  Monkhorst-Pack (*38*) *k*-point sampling, and a plane-wave cutoff of 400 eV. The perfect graphene basal plane surface and three defectivegraphene surfaces each with unique vacancy sites were investigated. Specifically, the following three vacancy sites were studied: the vacancy site with one carbon atom missing (monovacancy or V1) (*39*), the double vacancy (C2), which is comprised of two pentagonal rings and one octagonal ring referred to as the 5-8-5 defect, and the Stone-Wales (SW) defect (5-7-7-5) (*39, 40*) whose importance is often highlighted with respect to its demonstrated mechanical properties in carbon nanotubes and other graphitic materials, which are thought to be responsible for nanoscale plasticity and ductility (*41*). Since the monovacancy site was found to be the most reactive toward  $CO<sub>2</sub>$ , results associated with this defect site in addition to the defect-free graphene are discussed in detail. A thorough discussion of the adsorption mechanisms associated with  $CO<sub>2</sub>$  on the C2 and SW defect sites is available in the Supporting Information (SI). Due to the heterogeneity of the carbon matrix of coal and those comprised of gas shales, it is assumed that defect sites of these types in addition to graphene edge sites could be characteristic of active sites for adsorption on pore surfaces.

The adsorption energies,  $E_{ads}$ , can be calculated from eq 1:

$$
E_{\rm ads} = E_{\rm surf+CO_2} - E_{\rm surf} - E_{\rm CO_2} \tag{1}
$$

where  $E_{\rm surf}$  and  $E_{\rm CO_2}$ correspond to the total energies of the optimized defective surface and the isolated gas-phase  $CO<sub>2</sub>$ molecule, respectively, and  $E_{\text{surf}+CO_2}$  represents the total energy of the optimized surface- $CO_2$  system. The  $CO_2$  molecule was initially placed at a certain molecular height with various possible configurations, where it was considered to be noninteracting with the defective surface. The molecular height refers to the distance between the central carbon atom of the CO2 molecule and a fixed reference carbon atom in the basal plane in the *z*-direction. The physisorption pathway of  $CO<sub>2</sub>$  was determined by optimizing the geometry of  $CO<sub>2</sub>$ upon a given surface at varying stepwise distances from the



**FIGURE 1.** Structures of CO<sub>2</sub> physisorption and chemisorption on the monovacancy site using a  $6 \times 6$  unit cell with partial to full **flexibility: gray, carbon atoms; red, oxygen atom.**

surface. After examining a number of possible pathways with different  $CO<sub>2</sub>$  orientations, the  $CO<sub>2</sub>$  molecule was allowed to fully relax at each  $CO<sub>2</sub>$ -surface height considered. The potential energy associated with each  $CO<sub>2</sub>$ -surface distance was plotted, with the minimum energy representing the  $CO<sub>2</sub>$ physisorption energy. The chemisorption state was determined by moving the  $CO<sub>2</sub>$  molecule further along the minimum energy path toward the vacancy site to a second potential well (deeper than the first). The potential energy surface plots are presented in the SI.

Vibrational frequencies for gas-phase CO<sub>2</sub>, physisorbed and chemisorbed states have been calculated. Density of states, Bader charge, and charge difference analyses were also carried out to further understand the electronic structure of both the defective surface and  $CO<sub>2</sub>$ -surface complex throughout the adsorption process.

#### **3. Results and Discussion**

**3.1. Inclusion of All-Atom System Flexibility.** Within the current investigation, to determine the characteristics of an isolated vacancy site, a  $6 \times 6$  unit cell was employed to avoid interaction between periodic unit cells that may be encountered using the  $4 \times 4$  unit cell, which was employed by Cabrera-Sanfelix (31). Two sets of  $6 \times 6$  unit cells were investigated within the defective graphene surface calculations. Within the first type of the  $6 \times 6$  unit cell, the surface carbon atoms that were nearest and next-nearest neighbors of the vacancy site were allowed full flexibility. The third and fourth nearest-neighbors were fixed in order to minimize elastic interactions between periodic vacancy defects. A second set of  $6 \times 6$  unit-cell calculations were carried out, in which all the surface carbon atoms were allowed full flexibility, providing a more realistic representation. Calculations were also carried out using the small unit cell  $(4 \times 4)$ and are available in the SI.

The physisorption energies were calculated to be ∼50 meV for CO2 onto the perfect graphene and ∼210 meV for  $CO<sub>2</sub>$  onto the monovacancy site with the 6  $\times$  6 unit cell with full flexibility, which are consistent with the results of  $~51$ meV for the perfect graphene and ∼225 meV for the monovacancy site calculated by the  $4 \times 4$  unit cell. However, the chemisorption predictions are different depending on the size of the unit cell used and extent of system flexibility, as shown in Figure 1 (a) and (c). In the current work the  $CO<sub>2</sub>$ adsorbs to the defect site in a symmetric fashion, which is expected since  $CO<sub>2</sub>$  and the surface are both symmetric systems. All previous studies have concerning  $CO<sub>2</sub>$ -graphitic surface interactions have postulated asymmetric adsorption behavior of CO<sub>2</sub> on surface defect sites (27, 31), which is counterintuitive to what is expected due to the symmetry of the  $CO_2$ -surface system. The current work is the first to reveal a symmetric mechanism of adsorption. Therefore, the adsorption mechanisms discussed in the remainder of the

manuscript are concerning the  $6 \times 6$  unit cell with all of the surface carbon atoms flexible.

**3.2. Adsorption Energy and Structure.**The physisorption energy of  $CO<sub>2</sub>$  on the monovacancy site is ~210 meV, and the chemisorption energy is ~1.72 eV. The details of the CO<sub>2</sub> physisorption calculations for the defect and defect-free graphene surfaces are available in the SI and only the physisorption and chemisorption mechanism of  $CO<sub>2</sub>$  on the monovacancy site will be presented in detail. As shown in Figure 1 (b), when  $CO<sub>2</sub>$  is physisorbed on the monovacancy site, the molecular height of the  $CO<sub>2</sub>$  molecule is 3.45 Å, which is comparable to the DFT results of 3.47 Å predicted by Cabrera-Sanfelix (*31*). Due to the interactions between the adsorbent and adsorbate, the graphene surface carbon atoms move toward the  $CO<sub>2</sub>$  molecule, with the height of the highest carbon atom being 0.75 Å. Similarly, as shown in Figure 1 (c), when  $CO<sub>2</sub>$  is chemisorbed on the monovacancy site, the height of the previous central carbon atom decreases to 2.01 Å, and the two oxygen atoms of the  $CO<sub>2</sub>$  molecule attract the surface carbon atoms allowing them to move upward, resulting in a height of 1.32 Å.

The interaction with defective graphene (monovacancy) surfaces yields stronger CO<sub>2</sub>-surface interactions compared to perfect graphene or the other two vacancy sites, that is, <sup>5</sup>-7-7-5 and 5-5-8. More specifically, the physisorption energy of  $CO<sub>2</sub>$  on the defective graphene site with one carbon atom missing (monovacancy) is approximately 4 times as strong as that on a perfect graphene surface or the other two vacancy sites,  $5 - 7 - 7 - 5$  and  $5 - 8 - 5$ .

**3.3. Geometric Structure and Vibrational Frequency Predictions.** As shown in Table 2, the bond lengths and bond angle of physisorbed  $CO<sub>2</sub>$  changed compared to the gasphase  $CO<sub>2</sub>$  molecule.  $CO<sub>2</sub>$  is a linear molecule in the gas phase  $(42)$ ; however, when  $CO<sub>2</sub>$  is physisorbed, the bond angle becomes ∼178°. The vibrational frequencies of gas-phase  $CO<sub>2</sub>$  and physisorbed  $CO<sub>2</sub>$  on the monovacancy site were also calculated. The vibrational frequencies of the asymmetric (*ν*3) and symmetric stretching (*ν*1) modes for gas-phase CO<sub>2</sub> were calculated to be 2360  $\text{cm}^{-1}$  and 1321  $\text{cm}^{-1}$ , which are comparable to the experimental value of 2349  $cm^{-1}$  and 1333  $cm^{-1}$ , respectively (42, 43). The doubly degenerate  $CO<sub>2</sub>$ bending frequency (*ν*2) for gas-phase CO<sub>2</sub> is calculated to be  $638 \text{ cm}^{-1}$ , which is comparable to the experimental value of 667 cm-<sup>1</sup> (*42, 43*). There are slight discrepancies between the DFT-calculated vibrational frequencies and the experimental values, which is fairly typical in quantum chemistry calculations (*44*). The discrepancy between the DFT result and the true vibrational frequency arises in part because of the harmonic treatment of the vibrations, but is also due to the inexact nature of DFT in solving the Schrödinger equation. To correct for this discrepancy, an empirical scaling factor can be applied, with the scaling factors for GGA typically ranging between 0.95 and 0.99 (*44*), which is inline with the



**TABLE 2**. **Geometry and Vibrational Frequency Comparison**



scaling required for our predictions to agree with experimental measurements. The calculated  $C=O$  asymmetric stretching mode ( $v3$ ) for physisorbed CO<sub>2</sub> of 2353 cm<sup>-1</sup> is comparable to the value reported in the literature of 2356  $\text{cm}^{-1}$  (31). This calculated C=O asymmetric stretching mode for physisorbed  $CO<sub>2</sub>$  downshifts by 7 cm<sup>-1</sup> to a slightly lower value compared to the calculated gas-phase  $\rm CO_2$  of 2360  $\rm cm^{-1}$ . In terms of experimental comparison, there are no direct results of CO<sub>2</sub> physisorbed on the graphene monovacancy site, but it is reasonable to compare with  $CO<sub>2</sub>$  physisorbed on different coal and other carbon materials since the monovacancy site in addition to other defects are likely to exist in the undercoordinated and heterogeneous carbon frameworks of these systems. The experimental asymmetric stretching frequencies (*ν*3) of physisorbed pure CO<sub>2</sub> downshifts to the range of 2335-2332  $cm^{-1}$  for  $CO_2$  adsorbed in various dried coals (*45*) measured using attenuated total reflectance-Fourier transform infrared (ATR-FTIR) spectroscopy as a function of time at constant  $CO_2$  pressure (∼0.62 MPa) and temperature (∼328.15 K). Downshifts to the value of 2326 cm<sup>-1</sup> for  $CO_2$  adsorbed on a  $C_{60}$  film (crystal sizes in the range of  $0.025-0.2 \mu m$ , and downshifts to the value of 2341  $\text{cm}^{-1}$  for CO<sub>2</sub> on a graphite film (with cavity of 10-30  $\mu$ m in diameter, and assume CO<sub>2</sub> adsorbs on the basal plane) recorded using Perkin-Elmer 580B Infrared and Nicolet 520 FTIR spectrophotometers at equilibrium pressures less than 100 mTorr (∼13.3 Pa) and temperatures in the range of <sup>120</sup>-150 K (*46*). To a reasonable approximation, each of the vibrations within the  $CO<sub>2</sub>$  molecule can be regarded as a harmonic oscillator, with the vibrational frequency proportional to the square root of the bond's force constant, reflecting the strength of the bond through its magnitude (*47*). The fact that the vibrational frequencies are higher indicate that the C=O bond is stronger when the  $CO<sub>2</sub>$ molecule is physisorbed onto the monovacancy site than that physisorbed on the perfect carbon materials like  $C_{60}$  and graphite. Upon interaction with the monovacancy site, the doubly degenerate  $CO<sub>2</sub>$  bending mode ( $v2$ ) of  $CO<sub>2</sub>$  is separated into two different vibrations attributed to the change of symmetry of the molecule, that is, an in-plane bending mode and an out-of-plane bending mode. The bending modes  $(v2)$  were calculated to be  $631/588$  cm<sup>-1</sup> for  $CO<sub>2</sub>$  on the monovacancy site. These decoupling bending modes ( $v2$ ) were reported to be 654/652 cm<sup>-1</sup> for CO<sub>2</sub> on C<sub>60</sub>, and  $662/657$  cm<sup>-1</sup> for CO<sub>2</sub> on graphite (46), both showed a downshift compared to the *ν*2 mode in the gas phase. The asymmetric (*ν*3) and symmetric (*ν*1) modes of the C-O bond were calculated to be  $1319 \,\mathrm{cm}^{-1}$  and  $1256 \,\mathrm{cm}^{-1}$ , respectively. These values are much lower than those of the carbon-oxygen double bonds in the  $CO<sub>2</sub>$  molecule. Together with the fact that the carbon-oxygen bond length increases, it can be concluded that the  $\overline{C}=O$  bonds are broken when the  $CO<sub>2</sub>$ molecule is chemisorbed on monovacancy site. In terms of  $CO<sub>2</sub>$  chemisorption on the defective carbon surfaces, high temperature and/or pressure is required to overcome the energy barrier of the chemisorbed state. To the authors' knowledge there exist no experimental vibrational frequency data at the high temperature (may be up to ∼330 K) and pressure conditions (may be more than ∼5 MPa) (*48*) representative of coal and gas shale at sequestration depths for comparison with the theoretical predictions of the current work.

**3.4. Electronic Structure.** The change in charge density was plotted for the  $CO<sub>2</sub>$  physisorption and chemisorption complexes on the surface with themonovacancy site. Positive values in the change of charge density indicate a gain of electrons, with negative values representing a loss. As shown in Table 3 (a), when  $CO<sub>2</sub>$  is physisorbed onto the surface, the reactive surface carbon atom donates electrons to the region between the  $CO<sub>2</sub>$  central carbon atom and itself to strengthen the attraction between  $CO<sub>2</sub>$  and the surface. In addition, two small regions of electron accumulation appear near both

**TABLE 3. Change in Charge Density (Contour) and Bader Charge Analysis for CO<sub>2</sub> Physisorbed on the Monovacancy Site. Black Dots in Contour: Surface Carbon Atoms; Grey Dot in Contour: CO<sub>2</sub> Central Carbon Atom; White Dots in Contour: CO<sub>2</sub> Oxygen Atoms**



oxygen atoms; therefore, there is higher electron density surrounding  $CO<sub>2</sub>$  compared to that of  $CO<sub>2</sub>$  in the gas phase, which once again indicates that the  $CO<sub>2</sub>$  molecule binds to the surface becoming more stable upon physisorption onto the defect site.

This conclusion generated by the charge difference analysis can also be determined by a Bader charge analysis (*49*). Positive values of a Bader charge analysis represent the gain of electrons compared to that of the original structure, while negative values represent a loss. As shown in Table 3 (a), the reactive surface carbon atom loses 0.05 electrons, and each of the two oxygen atoms gain 0.0178 and 0.006 electrons, respectively, consistent with the results of the change in charge density calculations.

A similar analysis was carried out for  $CO<sub>2</sub>$  chemisorption on themonovacancy site. As shownin Table 3 (b), the electron densitymoves toward the region between the reactive surface carbon atom and the  $CO<sub>2</sub>$  central carbon atom, as well as the region between each vacancy carbon atom and oxygen atom. The accumulation of electrons in these regions indicates a new C-C bond and the formation of two C-O bonds. It can also be seen from the profile that electron densities move away from the region between each oxygen atom and the  $CO<sub>2</sub>$  central carbon atom, and thus the original C=O bonds are weakened upon  $CO<sub>2</sub>$  chemisorption onto the vacancy

site. Within both scenarios, the defect site seems to allow for enhanced electron transport and versatility depending on the acid-base nature of the adsorbate, with one defect carbon atom acting as a Lewis base donating its electron density to the carbon atom of  $CO<sub>2</sub>$  and the other two defect carbon atoms acting as Lewis acids withdrawing electron density from the two oxygen atoms of  $CO<sub>2</sub>$ .

Again, using the Bader charge analysis, as shown in Table  $3$  (b), the  $CO<sub>2</sub>$  central carbon atom gains electrons while the reactive surface carbon atom lose electrons, which is consistent with the fact that a new C-C bond forms. In addition, each vacancy carbon atom donates electrons to form a new  $C$  $-$ O bond. In its final chemisorbed state, the  $CO<sub>2</sub>$  molecule is chemisorbed on the defective graphene surface.

Our current work suggests that  $CO<sub>2</sub>$  bonds stronger to the defective graphene surface than perfect graphene. Understanding the mechanism by which  $CO<sub>2</sub>$  adsorbs on defective graphene surfaces will ultimately provide insight into not only the mechanism associated with potential long-term storage of  $CO<sub>2</sub>$  in coalbeds and gas shales and the feasibility of these strategies as carbon abatement options, but also an idea for screening and designing of organic porous materials for  $CO<sub>2</sub>$  capture. Additionally, these focused  $CO<sub>2</sub>$ -surface investigations may provide insight into the mechanism by

which coal may plasticize upon  $CO<sub>2</sub>$  interaction. For the application of  $CO<sub>2</sub>$  storage, the existence of  $H<sub>2</sub>O$  may affect the partial charge distribution of the vacancy sites, and this effect will be investigated in the future work.

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## **Supporting Information Available**

Additional information including Figures S1-S7 and Tables S1-S4. Thismaterial is available free of charge via the Internet at http://pubs.acs.org.

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