



## Article

# Adsorption and Gas-Sensing Properties of Ag<sub>n</sub> (n = 1–4) Cluster Doped GeSe for CH<sub>4</sub> and CO Gases in Oil-Immersed Transformer

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**Abstract:** The adsorption mechanism of CO and CH<sub>4</sub> on GeSe, modified with the most stable 1–4 Ag-atom clusters, is studied with the help of density functional theory. Adsorption distance, adsorption energy, total density of states (TDOS), projected density of states (PDOS), and molecular orbital theory were all used to analyze the results. CO was found to chemisorb exothermically on GeSe, independent of Ag cluster size, with Ag<sub>4</sub>-GeSe representing the optimum choice for CO gas sensors. CH<sub>4</sub>, in contrast, was found to chemisorb on Ag-GeSe and Ag<sub>2</sub>-GeSe and to physisorb on Ag<sub>3</sub>-GeSe and Ag<sub>4</sub>-GeSe. Here, Ag GeSe was found to be the optimum choice for CH<sub>4</sub> gas sensors. Overall, our calculations suggest that GeSe modified by Ag clusters of different sizes could be used to advantage to detect CO and CH<sub>4</sub> gas in ambient air.

**Keywords:** Ag<sub>n</sub>-GeSe; adsorption; DFT; CH<sub>4</sub>; CO



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## 1. Introduction

The oil-immersed transformer has been widely used in the modern power system due to its low cost and high power conversion efficiency [1]. Transformer insulation oil is mainly alkanes, cycloalkanes, saturated hydrocarbons, aromatic unsaturated hydrocarbons, and their compounds [2–4]. However, during a long service period, a transformer may inevitably suffer from local overheating and partial discharge faults [5,6]. These faults threaten the safety of the entire electrical system because the huge heat and strong distorted electrical field released by the faults may lead to the rupture of the C-C bond and C-H bond of the insulating oil medium, resulting in the generation of activated hydrogen and unstable hydrocarbon free radicals [7–9]. With the existence of impurities (H<sub>2</sub>O and O<sub>2</sub>) in the transformer, various decomposition products are dissolved in oil products, such as H<sub>2</sub>, CH<sub>4</sub>, CO, CO<sub>2</sub>, C<sub>2</sub>H<sub>2</sub>, and C<sub>2</sub>H<sub>6</sub> [10–12]. Decomposition product detection is an effective method for online monitoring of transformer faults [13,14]. Since CO and CH<sub>4</sub> are two typical gases in transformer faults, the condition of a transformer can be predicted by analyzing the concentrations of these two gases [15–17]. Due to the low cost and portability of gas sensors, it has been widely used in various fields, including electric power online monitoring [18,19]. Therefore, the gas sensor-based detection of CO and CH<sub>4</sub> could be a potentially effective means to realize fault detection in transformers [20].

In recent years, GeSe has been widely used in gas-sensing materials because it has a large specific surface area and abundant hole structure [21,22]. More resistant to oxidation and more stable at high temperatures than carbon nanotubes, GeSe is therefore more suitable for gas detection than carbon nanotubes [23,24]. As a result, it is one of the most widely used materials in high temperature and high pressure environments [25]. Gui et al. studied the adsorption behavior of CO, CH<sub>4</sub>, C<sub>2</sub>H<sub>2</sub>, C<sub>2</sub>H<sub>4</sub> on metal oxide (CuO, NiO, Ag<sub>2</sub>O)-doped GeSe surfaces; Guo et al. investigated the adsorption characteristics of C<sub>2</sub>H<sub>2</sub>, CH<sub>4</sub>, H<sub>2</sub> on SnO<sub>2</sub>-GeSe (SnO<sub>2</sub> doped onto GeSe surfaces) [26,27]. However, the ability of intrinsic GeSe to adsorb gases is limited, such as CH<sub>4</sub>, C<sub>2</sub>H<sub>2</sub>, H<sub>2</sub>, etc., [12,28].

Doping of metal clusters is a common method of material surface modification, which improves gas detection accuracy and adsorption capacity by changing the energy gap of gas sensors. [29,30]. Among the most used metal clusters (Pd, Pt, Au, Ag, Ni) and other metal elements, doping brings good adsorption characteristics and adsorption capacity [31–36]. Silver metal has been widely studied in doping modification because of its good physical properties. W.A et al.'s application of Ag doping shows that Ag has a good modified adsorption function and can bring better adsorption capacity to the substrate [37]. In this paper, GeSe was doped with Ag clusters to enhance the gas-sensitive response to CH<sub>4</sub> and CO.

In this paper, the Ag cluster-modified GeSe is proposed as a promising sensing material for monitoring transformer faults. First, the most stable doping structures of 1–4 Ag atoms on GeSe (Ag<sub>n</sub>-GeSe) were optimized. Then, the most stable structures were chosen to adsorb the gas molecules. The Ag clusters' doping and gas adsorption mechanisms were analyzed. By analyzing the structure optimization, adsorption energy, band gap, the density of states (DOS), and charge transfer, it was found that the Ag cluster-modified GeSe sensor with high detection response and detection speed has great potential to become a new type of resistive gas sensor. This study provides a new monitoring method and way for the gas insulation monitoring of decomposing components in oil.

## 2. Computational Details and Methods

All calculations were performed based on the density functional theory (DFT) [33,38]. A generalized gradient approximation (GGA) was used to calculate the electron exchange and correlation energy [39,40]. The Perdew–Burke–Ernzerhof (PBE) function was used to calculate the interaction effect between electrons [41]. The DFT-based semi-core pseudopotential (DSPP) and double numerical plus polarization (DNP) were selected [42]. The self-consistent field convergence precision was set to  $1 \times 10^{-6}$  Ha. The energy convergence accuracy, maximum stress, and max displacement were set as  $1 \times 10^{-5}$  Ha,  $2 \times 10^{-3}$  Ha/Å, and  $5 \times 10^{-3}$  Ha, respectively [43,44]. Since Ag<sub>n</sub>-GeSe is not magnetic, the spin polarization is limited during structural optimization [45]. A k-point grid of  $5 \times 5 \times 1$  was selected for the Brillouin zone integration to obtain accurate energies and structures [46]. In the solvent model, the dielectric constant was set to 2.2 to simulate the insulating oil model. To avoid layer-to-layer interactions, we constructed a  $4 \times 4 \times 1$  single nanotube supercell containing 32 Se atoms and 32 Ge atoms for DFT calculations. The distance between layers was greater than 25 Å.

As defined in Equation (1), the adsorption energy represents the energy change in the adsorption process and can be analyzed to find the most stable structure of gas adsorption. If the adsorption energy is negative, it means that the reaction is exothermic and occurs spontaneously. Charge transfer ( $Q_T$ ) was obtained by Mulliken population analysis. As defined in Equation (2),  $Q_{ads}$  and  $Q_{iso}$ , respectively, represent the net carried charges of the gas molecule after and before adsorption. A positive  $Q_T$  shows that electrons transfer from the gas molecule to the Ag<sub>n</sub>-GeSe monolayer. The energy gap between the highest occupied orbit (HOMO) and the lowest unoccupied orbit (LUMO) is defined in Equation (3). The total density of states (TDOS) and projected density of states (PDOS) were analyzed in detail to analyze the mechanism of the adsorption process.

$$E_{ads} = E_{Ag_n-GeSe/gas} - E_{Ag_n-GeSe} - E_{gas} \quad (1)$$

$$Q_T = Q_{ads} - Q_{iso} \quad (2)$$

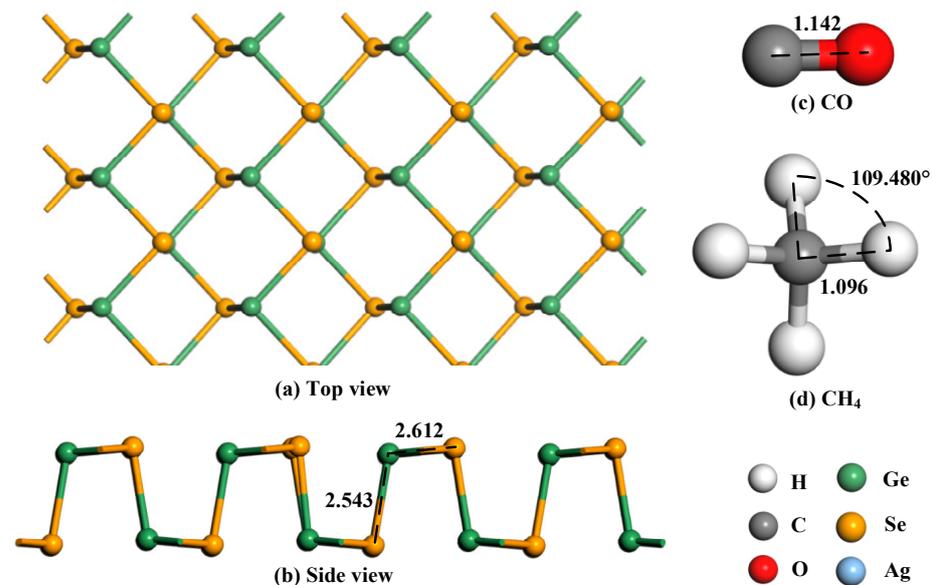
$$E_g = |E_{HOMO} - E_{LUMO}| \quad (3)$$

## 3. Results and Discussion

### 3.1. Geometry Optimization

In order to study the gas adsorption characteristics of GeSe, the top view and side view of GeSe were obtained through modeling, as shown in Figure 1. The structures of CO

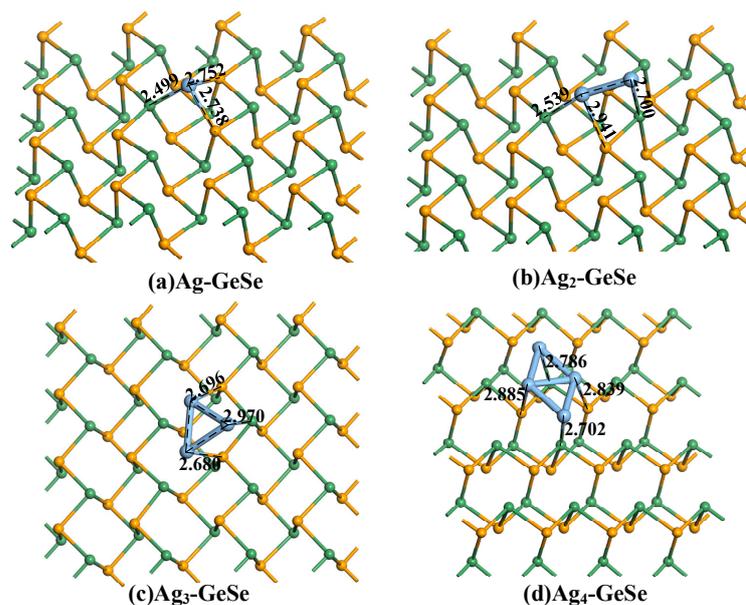
and CH<sub>4</sub> molecules were obtained as shown in Figure 1c,d. The bond lengths between Ge and Se were 2.543 Å (longitudinal) and 2.612 Å (transverse). The reason why the transverse distance is larger than the longitudinal distance is that Ge bonds with two transverse Se atoms, while the longitudinal one bonds with only one Se atom, making the longitudinal Se atom more stable and the longitudinal bond length shorter. The CO molecule is a linear structure with a bond length of only 1.142 Å. The CH<sub>4</sub> molecule is a regular tetrahedral structure, and it is a stable gas molecule in air. The bond length of each C-H bond is 1.096 Å, and the bond angle is 109.480°.



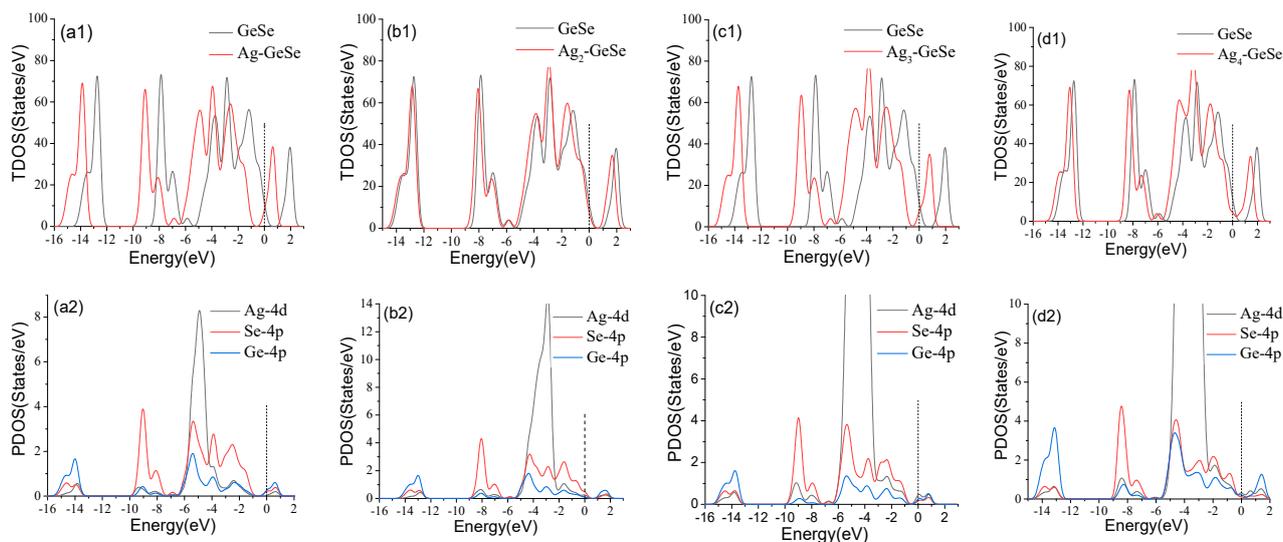
**Figure 1.** Structures of GeSe and gas molecules (a) Top view, (b) side view, (c) CO molecule, (d) CH<sub>4</sub> molecule. The distance is in Å.

Figure 2 shows the most stable structure of Ag<sub>n</sub>-GeSe obtained by doping one to four Ag atoms. The doping distance is 2.499 Å, 2.539 Å, 2.680 Å, and 2.702 Å for 1–4 Ag atoms modified GeSe. Based on the Mulliken population, the four types of Ag cluster act as electron acceptors obtaining 0.048 *e*, 0.184 *e*, 0.206 *e*, and 0.288 *e* electron from GeSe, respectively. The redistribution of electric charge leads to the change of conductivity of the system.

As shown in Figure 3, TDOS and PDOS were analyzed to further analyze the doping mechanism of Ag atom doping on GeSe. The peak values of the TDOS of the four Ag cluster-doped GeSe bases shift to the left obviously, which makes the Fermi level continuous. Figure 3(a2–d2) shows the PDOS of GeSe doped with four types Ag<sub>n</sub>-GeSe. The analysis of PDOS showed that the peak value above the Fermi level shifted to the left due to the hybridization of Ag-4*d*, Se-4*p*, and Ge-4*p* orbitals, thus improving the conductivity of the system. It can be seen from Figure 3(a1,a2) that the hybridization of Ag-4*d* and Se-4*p* orbitals in one Ag atom doping system from −4.0 eV to −6.0 eV resulted in a significant increase in TDOS at −5.0 eV. It can be seen from Figure 3(b1,b2) that the Ag-4*d* and Se-4*p* orbitals of double Ag atoms doping system hybridized at −1.0 eV~−2.0 eV, resulting in a significant increase in TDOS at −1.5 eV. Figure 3(c1,c2) shows that the Ag-4*d* and Se-4*p* orbitals hybridized at −3.0 eV~−4.0 eV in the triple Ag atoms doping system, resulting in a significant increase in TDOS at −4.0 eV. It can be seen from Figure 3(d1,d2) that the hybridization of Ag-4*d* and Ge-4*p* orbitals of the quadruple Ag atoms doping system at −4.0 eV~−5.0 eV resulted in a significant increase in TDOS at −4.5 eV. In general, a strong orbital hybridization results in a stable Ag<sub>n</sub>-GeSe structure, indicating that Ag cluster-doping on the GeSe surface is stable enough for further gas adsorption.



**Figure 2.** The stable structures of  $\text{Ag}_n\text{-GeSe}$ . (a)  $\text{Ag-GeSe}$ , (b)  $\text{Ag}_2\text{-GeSe}$ , (c)  $\text{Ag}_3\text{-GeSe}$ , (d)  $\text{Ag}_4\text{-GeSe}$ . The distance is in Å.

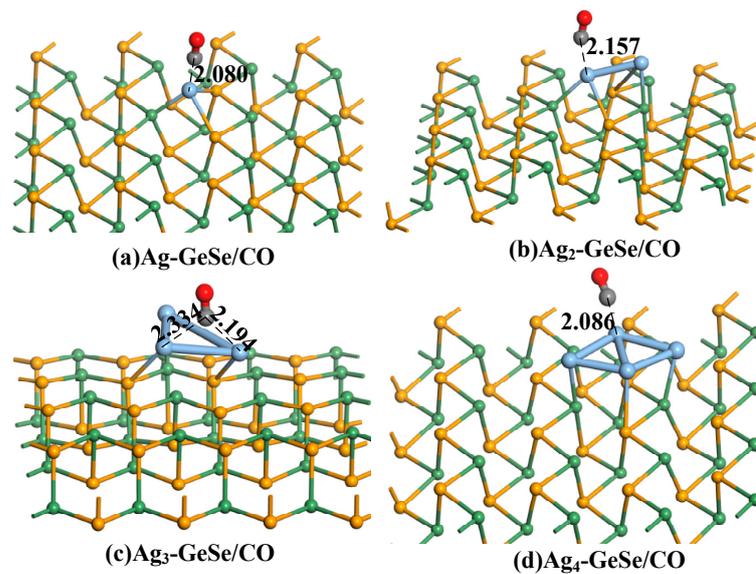


**Figure 3.** TDOS and PDOS before and after 1–4 Ag atoms doping on GeSe. (a1,a2)  $\text{Ag-GeSe}$ , (b1,b2)  $\text{Ag}_2\text{-GeSe}$ , (c1,c2)  $\text{Ag}_3\text{-GeSe}$ , (d1,d2)  $\text{Ag}_4\text{-GeSe}$ .

### 3.2. Analysis of CO Gas Adsorption on $\text{Ag}_n\text{-GeSe}$ Surface

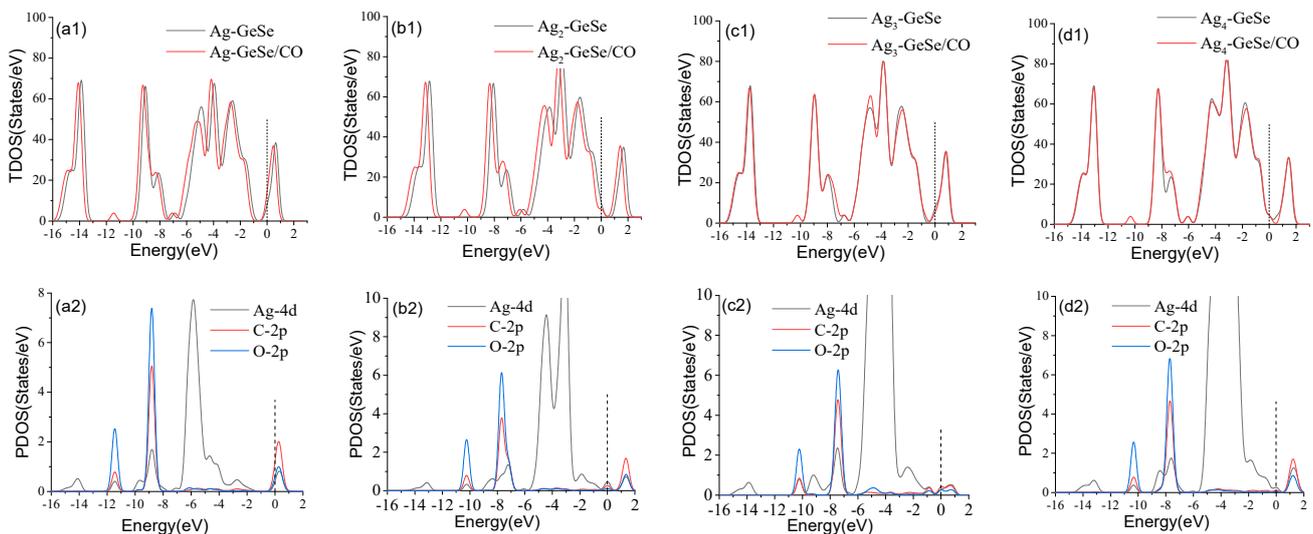
To study the adsorption behavior of gas molecules on  $\text{Ag}_n\text{-GeSe}$ , gas molecules were made to approach Ag atoms from different directions and angles. The adsorption position with the largest adsorption energy was taken as the most stable adsorption structure, and then the density of states, band structure, and molecular orbit of the adsorption structures was analyzed.

Figure 4 shows the most stable CO adsorption structure. The adsorption distances of CO on the four  $\text{Ag}_n\text{-GeSe}$  systems were 2.080, 2.157, 2.194, and 2.086 Å respectively, and the C–O bond was not damaged in the adsorption process. It can be seen that the adsorption ability of our  $\text{Ag}_n\text{-GeSe}$  systems to CO was relatively moderate, which was conducive to the subsequent desorption process, resulting in high sensitivity and reusability of the gas-sensing material. The C atom tends to adsorb on the Ag atom in the CO adsorption process.



**Figure 4.** The adsorption structures of gas molecules on  $Ag_n$ -GeSe. (a) Ag-GeSe/CO, (b)  $Ag_2$ -GeSe/CO, (c)  $Ag_3$ -GeSe/CO, (d)  $Ag_4$ -GeSe/CO. The distance is in Å.

Figure 5 shows the DOS analysis of  $Ag_n$ -GeSe before and after CO adsorption. It can be seen from Figure 5(a1–d1) that the peak value of TDOS shifted significantly to the left after gas adsorption, making it continuous at the Fermi level. It can be seen from Figure 5(a1,a2) that Ag-GeSe had a new peak value due to the hybridization of Ag-4d, C-2p, and O-2p from  $-11.0$  to  $-12.0$  eV in the CO adsorption process. In Figure 5(b1,b2), it can be seen that  $Ag_2$ -GeSe had a new peak value due to the hybridization of Ag-4d, C-2p, and O-2p from  $-10.0$  to  $-11.0$  eV during CO adsorption. The peak of  $Ag_3$ -GeSe and  $Ag_4$ -GeSe was roughly the same as that of  $Ag_2$ -GeSe.



**Figure 5.** TDOS and PDOS of gas molecules adsorption on  $Ag_n$ -GeSe. (a1) TDOS of CO on Ag modified GeSe (b1) TDOS of CO on  $Ag_2$  modified GeSe (c1) TDOS of CO on  $Ag_3$  modified GeSe (d1) TDOS of CO on  $Ag_4$  modified GeSe; (a2–d2) are PDOS of the corresponding subgraph.

The adsorption parameters of CO on the four doping structures are shown in Table 1, including adsorption distance, adsorption energy, and charge transfer. The adsorption energies of the four adsorption structures were  $-0.177$ ,  $-0.166$ ,  $-0.171$ ,  $-0.193$  eV. The charge transfer of the four adsorption structures during the adsorption process was 0.134, 0.105,

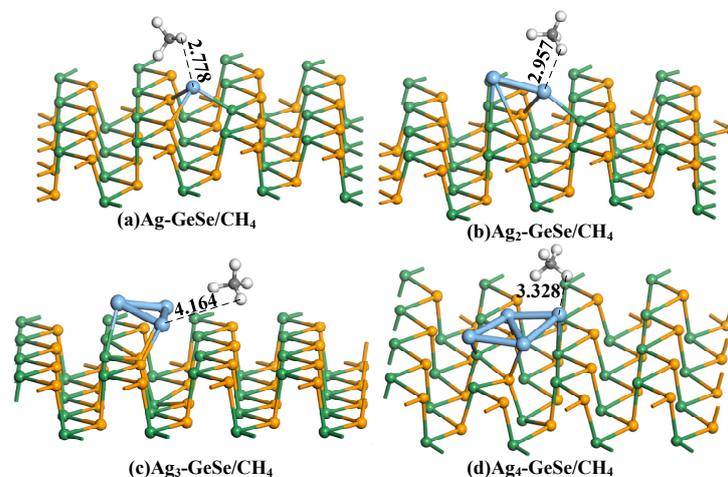
−0.014, −0.165  $e$ . The negative charge transfer indicates that the electron transfers from CO gas to  $\text{Ag}_n\text{-GeSe}$ , while the positive charge transfer indicates the transfer of electrons from  $\text{Ag}_n\text{-GeSe}$  to CO gas. From the moderate adsorption distance, large adsorption energy, and charge transfer,  $\text{Ag}_4\text{-GeSe}$  is more suitable for CO gas adsorption.

**Table 1.** Adsorption parameters of CO gas molecules on  $\text{Ag}_n\text{-GeSe}$ .

Configuration	Structure	$d$ (Å)	$E_{ads}$ (eV)	$Q_T$ (e)
Ag-GeSe/CO	Figure 4a	2.080	−0.177	0.134
$\text{Ag}_2\text{-GeSe/CO}$	Figure 4b	2.157	−0.166	0.105
$\text{Ag}_3\text{-GeSe/CO}$	Figure 4c	2.194	−0.171	−0.014
$\text{Ag}_4\text{-GeSe/CO}$	Figure 4d	2.086	−0.193	−0.165

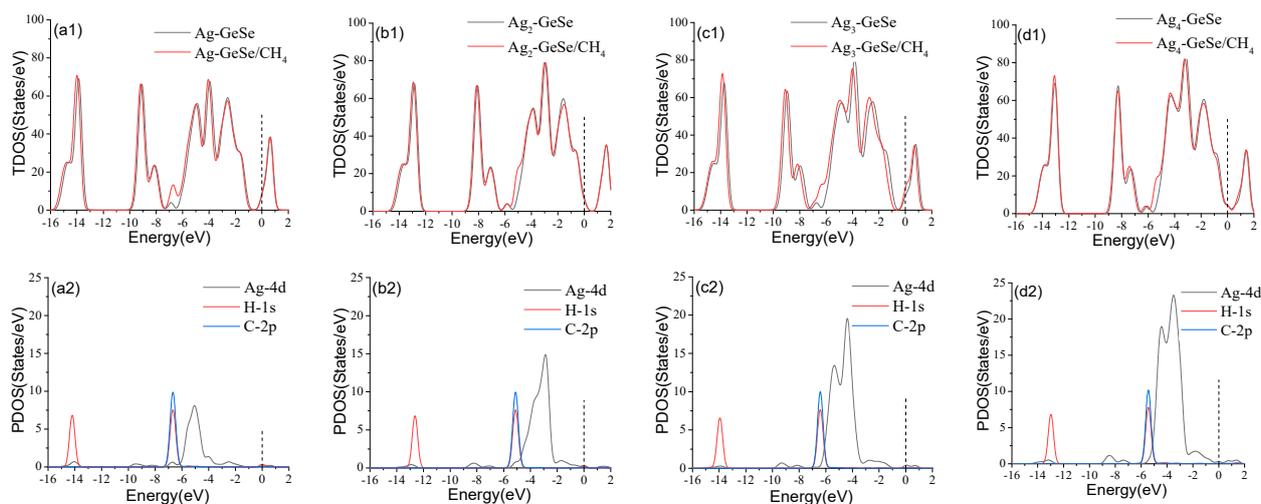
### 3.3. Analysis of $\text{CH}_4$ Gas Adsorption on $\text{Ag}_n\text{-GeSe}$ Surface

Figure 6 shows the most stable  $\text{CH}_4$  adsorption structure. The adsorption distances of  $\text{CH}_4$  on 1–4 Ag atom-doped GeSe were 2.778, 2.957, 4.164, and 3.328 Å, respectively. The structure of  $\text{CH}_4$  did not change during the adsorption process. Compared with CO adsorption, the adsorption distance of  $\text{CH}_4$  was much larger. The adsorption distances of  $\text{Ag}_3\text{-GeSe}$  and  $\text{Ag}_4\text{-GeSe}$  to  $\text{CH}_4$  reached 4.164 and 3.328 Å, respectively. With such a large adsorption distance, it can be inferred that  $\text{Ag}_3\text{-GeSe}$  and  $\text{Ag}_4\text{-GeSe}$  show physical adsorption to  $\text{CH}_4$ . Since the C atom is surrounded by four H atoms in the  $\text{CH}_4$  molecular structure, the H atom approaches the substrate in the adsorption process. In the four adsorption processes, C-H bonds elongate due to the effect of H-Ag bonding.



**Figure 6.** The most stable structures of gas molecules on  $\text{Ag}_n\text{-GeSe}$ . (a) Ag-GeSe/ $\text{CH}_4$  (b)  $\text{Ag}_2\text{-GeSe/CH}_4$  (c)  $\text{Ag}_3\text{-GeSe/CH}_4$  (d)  $\text{Ag}_4\text{-GeSe/CH}_4$ .

Figure 7 shows the density of states before and after  $\text{CH}_4$  adsorption on  $\text{Ag}_n\text{-GeSe}$ . After  $\text{CH}_4$  adsorption, the TDOS of the system moved significantly to the left, and the filling of electrons at the Fermi level increased, increasing the probability of electrons crossing the gap from the valence band to the conduction band. Therefore, the conductivity increased after  $\text{CH}_4$  adsorption. The TDOS of the four adsorption structures increased at −7.0, −6.0, −6.5 and −5.0 eV, respectively. This is mainly due to the strong hybridization of Ag-4d, H-1s, and C-2p orbitals. It can be seen from Figure 7(a2,b2), that there was a strong chemical bond between  $\text{CH}_4$  and Ag. However, the narrow orbital spike in Figure 7(c2,d2) indicated that there was no chemical bond between  $\text{CH}_4$  and Ag atoms, but only physical adsorption. The invariance of  $\text{Ag}_3\text{-GeSe}$  and  $\text{Ag}_4\text{-GeSe}$  at the Fermi level, and the minimal peak changes at other places also confirmed that the reaction was physical adsorption.



**Figure 7.** TDOS and PDOS of adsorption of gas molecules on  $Ag_n$ -GeSe. (a1) TDOS of  $CH_4$  on Ag modified GeSe (b1) TDOS of  $CH_4$  on  $Ag_2$  modified GeSe (c1) TDOS of  $CH_4$  on  $Ag_3$  modified GeSe (d1) TDOS of  $CH_4$  on  $Ag_4$  modified GeSe; (a2–d2) are PDOS of the corresponding subgraph.

The adsorption parameters of  $CH_4$  on  $Ag_n$ -GeSe are listed in Table 2, including adsorption distance, adsorption energy, and charge transfer. The adsorption energies of the four structures were  $-0.158$ ,  $-0.159$ ,  $-0.122$  and  $-0.018$  eV, respectively. The charge transfers were  $0.034$ ,  $0.013$ ,  $-0.068$ ,  $-0.026$  e, respectively. The long adsorption distance, small adsorption energy, and small charge transfer confirm that  $Ag_3$ -GeSe and  $Ag_4$ -GeSe are physical adsorptions to  $CH_4$ . Ag-GeSe is more suitable for  $CH_4$  gas adsorption according to the moderate adsorption distance, large adsorption energy, and moderate charge transfer.

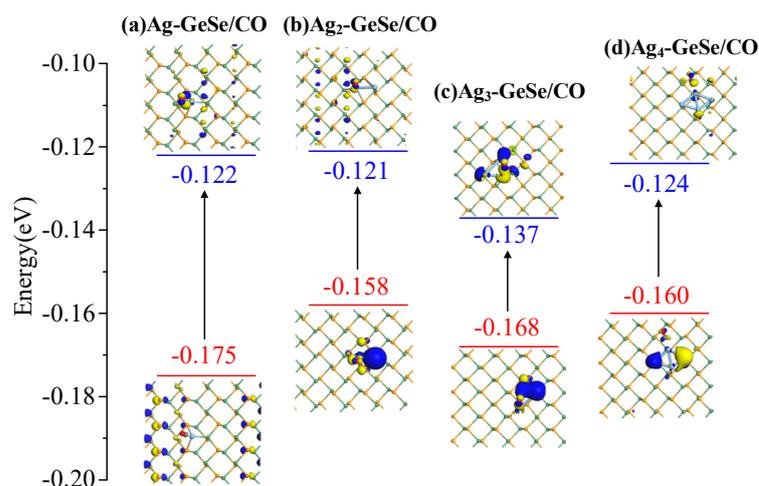
**Table 2.** Adsorption parameters of  $CH_4$  gas molecules on  $Ag_n$ -GeSe.

Configuration	Structure	$d$ (Å)	$E_{ads}$ (eV)	$Q_T$ (e)
Ag-GeSe/ $CH_4$	Figure 6a	2.778	$-0.158$	0.034
$Ag_2$ -GeSe/ $CH_4$	Figure 6b	2.957	$-0.159$	0.013
$Ag_3$ -GeSe/ $CH_4$	Figure 6c	4.164	$-0.122$	$-0.068$
$Ag_4$ -GeSe/ $CH_4$	Figure 6d	3.328	$-0.018$	$-0.026$

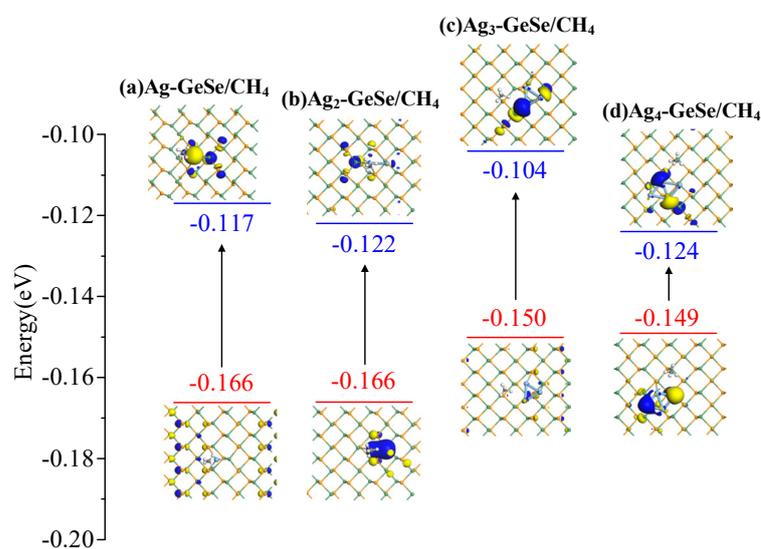
### 3.4. Molecular Orbital Theory Analysis of Gases Adsorption on $Ag_n$ -GeSe

The behavior of electron distribution in the adsorption process was analyzed by molecular orbital theory. The HOMO and LUMO of the CO and  $CH_4$  adsorption systems are shown in Figures 8 and 9, respectively. The energy gap between HOMO and LUMO can be a key indicator to evaluate the conductivity of the target structure. Before gas adsorption on  $Ag_n$ -GeSe, HOMO mainly distributed over Ag, indicating that the Ag atom provided electrons to interact with CO and  $CH_4$  gases as an active site. After CO and  $CH_4$  adsorption, HOMO changes became more concentrated on Ag, while LUMO became more uniform.

As shown in Table 3, the energy gaps of the four CO adsorption structures were  $0.053$ ,  $0.037$ ,  $0.031$  and  $0.036$  eV, respectively. There was a small HOMO and LUMO distribution of  $Ag_4$ -GeSe on Ag atoms upon CO adsorption, indicating that the electron distribution of the system was uniform, and the moderate band gap indicated that  $Ag_4$ -GeSe was more suitable for CO adsorption. The energy gaps of the four  $CH_4$  adsorption systems were  $0.049$ ,  $0.044$ ,  $0.046$  and  $0.025$  eV, respectively. After Ag-GeSe adsorbed  $CH_4$ , the band gap increased significantly, which made the conductivity of the system decrease significantly, so the conductivity change of the target system was more obvious. Therefore, Ag-GeSe is more suitable for the gas-sensing of  $CH_4$ .



**Figure 8.** HOMO and LUMO distribution after CO adsorption. (a) Ag-GeSe/CO system (b) Ag<sub>2</sub>-GeSe/CO system (c) Ag<sub>3</sub>-GeSe/CO system (d) Ag<sub>4</sub>-GeSe/CO system.



**Figure 9.** HOMO and LUMO distribution after CH<sub>4</sub> adsorption. (a) Ag-GeSe/CH<sub>4</sub> system (b) Ag<sub>2</sub>-GeSe/CH<sub>4</sub> system (c) Ag<sub>3</sub>-GeSe/CH<sub>4</sub> system (d) Ag<sub>4</sub>-GeSe/CH<sub>4</sub> system.

**Table 3.** Energy of HOMO, LUMO, and energy gap of CO and CH<sub>4</sub> adsorbed Ag<sub>n</sub>-GeSe systems.

Configuration	Structure	$E_{HOMO}$ (eV)	$E_{LUMO}$ (eV)	$E_g$ (eV)
Ag-GeSe	\	-4.707	-3.483	1.224
Ag <sub>2</sub> -GeSe	\	-4.555	-3.311	1.244
Ag <sub>3</sub> -GeSe	\	-4.700	-3.648	1.052
Ag <sub>4</sub> -GeSe	\	-4.329	-3.716	0.613
Ag-GeSe/CO	Figure 8a	-0.175	-0.122	0.053
Ag <sub>2</sub> -GeSe/CO	Figure 8b	-0.158	-0.121	0.037
Ag <sub>3</sub> -GeSe/CO	Figure 8c	-0.168	-0.137	0.031
Ag <sub>4</sub> -GeSe/CO	Figure 8d	-0.160	-0.124	0.036
Ag-GeSe/CH <sub>4</sub>	Figure 9a	-0.166	-0.117	0.049
Ag <sub>2</sub> -GeSe/CH <sub>4</sub>	Figure 9b	-0.166	-0.122	0.044
Ag <sub>3</sub> -GeSe/CH <sub>4</sub>	Figure 9c	-0.150	-0.104	0.046
Ag <sub>4</sub> -GeSe/CH <sub>4</sub>	Figure 9d	-0.149	-0.124	0.025

#### 4. Conclusions

In this work, the adsorption behaviors of 1–4 Ag atom-modified GeSe to CO and CH<sub>4</sub> gases were analyzed based on first principle calculations. The interaction mechanism between Ag<sub>n</sub>-GeSe and the gas molecules was comprehensively investigated by analyzing adsorption structure, the density of states, and molecular orbital theory. All four Ag<sub>n</sub>-GeSe structures chemisorb CO gas, but Ag<sub>4</sub>-GeSe is more suitable for CO gas sensors according to proper adsorption distance, large adsorption energy, and proper charge transfer. Ag-GeSe and Ag<sub>2</sub>-GeSe chemisorb, while Ag<sub>3</sub>-GeSe and Ag<sub>4</sub>-GeSe physisorb CH<sub>4</sub> gas. Based on the density of states and molecular orbital theory analysis, it can be concluded that Ag-GeSe is more suitable for the detection of CH<sub>4</sub> gas. Although the adsorption mechanism was slightly different for CO and CH<sub>4</sub> adsorption on different Ag atom-doping systems, the adsorption capacity was very close. In conclusion, Ag cluster-modified GeSe could be a suitable CO and CH<sub>4</sub> gas-sensing material for use in the power system.

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**Conflicts of Interest:** The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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