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## Insights into the adsorption mechanism and dynamic behavior of tetracycline antibiotics on reduced graphene oxide (RGO) and graphene oxide (GO) materials†

Yuejie Ai, <sup>\*a</sup> Yang Liu,<sup>a</sup> Yingzhong Huo,<sup>a</sup> Chaofeng Zhao,<sup>a</sup> Lu Sun,<sup>b</sup> Bing Han,<sup>a</sup> Xinrui Cao<sup>c</sup> and Xiangke Wang <sup>a</sup>

The widespread use of antibiotics from both agricultural and human sources has led to their environmental dissemination which is now recognized as a potential hazard to human health and aquatic ecosystems. Along with the extensive academic and social concerns on the impact of this new kind of emerging pollutant, the knowledge on their effective removal from the environment is increasing. However, the complex interactions between antibiotics and sorbents make the experimental studies difficult at the molecular level. To provide an insight into the adsorption mechanism and dynamic behavior of antibiotics, in this work, three tetracycline molecules, namely tetracycline (TTC), oxytetracycline (OTC), and chlortetracycline (CTC), have been chosen as the representative antibiotics to present a theoretical study on their adsorption properties by reduced graphene oxide (RGO) and graphene oxide (GO). The density functional theory (DFT) method and molecular dynamics (MD) simulations were used to address a number of key issues, such as the effects of distinct adsorption sites, pH, and solvent on the adsorption capacity. A closer look at the adsorption configuration and binding energy showed that the  $\pi$ - $\pi$  interaction was the driving force when TCs adsorbed on GO (or RGO), and hydrogen bonds played a significant role in the GO\_TC systems. The computed results showed that the tetracycline adsorption affinity for the graphene-based materials followed the order CTC > TTC > OTC and TTC > CTC > OTC in the GO and RGO systems, respectively. The comparison of binding energies at different pH values and solvents proposed that low pH and less polar solvent environments were beneficial to the adsorption efficiency of TCs on GO and RGO. In addition, molecular dynamics simulations have been used to assign the dynamic behavior of the TCs, analyzing the competitive adsorption process, and the intermolecular accumulation was verified to be involved in the adsorption behavior of TCs. The CTC molecule appeared to exhibit the strongest competitiveness. Our work gives a deep insight into the interactions between the graphene-based materials and TCs, and provides a theoretical basis for the further design of adsorbents used for the removal of tetracycline antibiotics in the environment.

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### Environmental significance

The environmental risks of antibiotics have attracted increasing attention due to their potential adverse effects on the environment. The complex interactions and especially the dynamic behaviors such as the competitive adsorption process make the experimental studies difficult at the molecular level. This work investigated the adsorption behavior of three kinds of representative tetracycline antibiotics (tetracycline, oxytetracycline, and chlortetracycline) on GO (or RGO) *via* the density functional theory (DFT) method and molecular dynamics (MD) simulations. This work provides a theoretical basis for the removal of tetracycline antibiotics in the environment.

<sup>a</sup> MOE Key Laboratory of Resources and Environmental System Optimization, College of Environmental Science and Engineering, North China Electric Power University, Beijing 102206, P. R. China. E-mail: aiyuejie@ncepu.edu.cn; Fax: +86 10 61772890; Tel: +86 10 61772890

<sup>b</sup> Institute of Modern Optics, Nankai University, Tianjin, 300350, P.R. China

<sup>c</sup> Department of Physics and Collaborative Innovation Center for Optoelectronic Semiconductors and Efficient Devices, Fujian Provincial Key Laboratory of

Theoretical and Computational Chemistry, Xiamen University, Xiamen 361005, P. R. China

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makes the experimental studies problematic, and it has sparked theoretical research that focused on the adsorption behavior of TCs on graphene-based materials. Peng *et al.*<sup>37</sup> investigated the adsorption of TTC on a graphene surface based on first principles calculations, showing the importance of  $\pi$ - $\pi$  interactions in the adsorption process. Another DFT calculation study by Zhang *et al.*<sup>34</sup> explored the adsorption of TTC on GO and RGO and they proposed that the TTC molecule showed strong affinity with  $sp^3$  and  $sp^2$  regions. Besides, a specific configuration of TTC has been proposed by Song and coworkers<sup>35</sup> in their theoretical investigation about RGOs. However, with the exception of a few research studies, there is a paucity of data on several key issues in the adsorption process of TCs onto graphene-based materials, such as the detailed geometric and electronic nature of different tetracyclines (TTC, OTC, and CTC) when they bind onto GO (or RGO). Meanwhile, since experimental results have shown that the pH value was the most crucial parameter among the other experimental conditions in the adsorption of TCs, the internal mechanism of this phenomenon is not clear and needs further elucidation. On the other hand, although the occurrence, fate and even removal of TCs have been extensively studied in the literature, their coexistence or competitive behavior is less publicly well understood when multiple pollutants coexist. In the natural environment, the coexistence of pollutants is very common and limited competitive adsorption experiments have only focused on the apparent adsorption phenomena, such as a decrease of adsorption capacity caused by competitive adsorption, or an increase caused by synergistic effect. Therefore, to sum up, it is crucial to use the means of theoretical methods and develop a thorough and comprehensive study to address major questions and concerns discussed above.

In this article, the density functional theory (DFT) method and molecular dynamics were carried out to investigate the geometric and electronic characters of tetracyclines (TCs) on graphene oxide (GO) and reduced graphene oxide (RGO). This study aims to (1) find out the most stable adsorption configuration of TCs on RGO and GO, and compare the adsorption performance of two adsorbents (RGO and GO) towards TCs; (2) explore the influence of low pH values and solvent on the adsorption process; (3) understand the competitive adsorption behavior of multiple tetracycline molecules on graphene materials (GO and RGO) by molecular dynamics calculations. This study can provide a theoretical basis for the application of graphene-based materials in the removal of tetracycline antibiotics.

## 2. Computational details

### DFT calculations

To understand the binding characteristics between GO (or RGO) and TCs, a  $7 \times 6$  supercell of graphene with a lattice constant of  $1.402 \text{ \AA}$  was chosen as the computational model of RGO. In addition, to save computational costs, the same

supercell modified with an epoxy group was taken as the representative model of GO. The electronic structures of adsorption complexes were obtained using the projector augmented-wave (PAW)<sup>38</sup> potentials of DFT calculations that were implemented in Vienna *ab-initio* simulation package (VASP).<sup>39</sup> The Perdew–Burke–Ernzerhof (PBE) version of the generalized gradient approximation (GGA) was employed to describe the exchange correlation potential and energy.<sup>40</sup> In addition, the dispersive interaction was considered using the DFT-D2 method of Grimme.<sup>41</sup> The cutoff radius for pair interactions and the global scaling factors  $S_6$  were  $50 \text{ \AA}$  and 0.75, respectively. The  $C_6$  parameters were set to 1.75, 0.14, 0.70, 1.23, and 5.07 for C, O, H, N and Cl atoms, and the  $R_0$  parameters for C, O, H, N and Cl atoms were 1.452, 1.001, 1.342, 1.397 and 1.639, respectively. Besides, the convergence criterion for the total energy was set to  $10^{-5} \text{ eV}$  and the cut-off energy was chosen to be 400 eV. Meanwhile, all of the structures were optimized until the Hellmann–Feynman force tolerance was smaller than  $0.02 \text{ eV \AA}^{-1}$  and the Brillouin-zone integrations were sampled with  $3 \times 3 \times 1$  Monkhorst–Pack special  $k$ -points. The adsorption energies ( $E_{\text{ad}}$ ) of the adsorbents (GO or RGO) towards TCs (TTC, OTC or CTC) were calculated according to the following formula:

$$E_{\text{ad}} = E_{(\text{adsorbents})} + E_{(\text{TCs})} - E_{(\text{adsorbents\_TCs})}$$

where  $E_{(\text{adsorbents})}$ ,  $E_{(\text{TCs})}$  and  $E_{(\text{adsorbents\_TCs})}$  represents the total electronic energies of the adsorbents (GO or RGO), TCs (TTC, OTC or CTC), and the combined adsorbent\_TC system, respectively.

Meanwhile, the solvation effect was calculated using the joint density functional theory framework as implemented in the VASP by Mathew and Hennig.<sup>42</sup>

### Classical MD simulations

According to the above DFT calculations, the GO model used for the MD simulation contains epoxy groups with a size of  $4.90 \times 4.97 \text{ nm}^2$  which is shown in Fig. S1.† For each kind of tetracycline antibiotic, eight molecules were inserted into a  $5.10 \times 5.04 \times 5.00 \text{ nm}^3$  simulation box that contains 3323 water molecules. Water molecules were simulated using the simple point charge (SPC) model.<sup>43</sup> The optimized potentials for liquid simulations-all atoms (OPLS-AA)<sup>44</sup> force field was used to parameterize the GO and TCs. Periodic boundary conditions were selected in all three directions of the box to eliminate adverse effects caused by boundary effects and other factors.<sup>45</sup> The cutoff radius for the vdW interaction was set to 1.2 nm. After annealing and equilibration, the systems were run for 100 ns in an NPT ensemble which used a Berendsen thermostat and an isotropic Parrinello–Rahman barostat to control the constant temperature ( $T = 298 \text{ K}$ ) and pressure ( $P = 1 \text{ bar}$ ), respectively.<sup>46,47</sup> The time-step was 1 fs and the trajectories were recorded every 10 ps. All the simulations were performed with the GROMACS software package.<sup>48</sup>

### 3. Results and discussion

#### 3.1. Electrostatic potential (ESP) of adsorbents and TCs

The molecular electrostatic potential was usually used to describe the surface electron density and electron activity<sup>49,50</sup> of a molecule. It has considerable fundamental significance in the study of molecular reactivity and intermolecular interaction, especially in non-covalent interactions. In order to investigate the possible active sites inside the TCs during the sorption, the electrostatic potentials have been plotted as shown in Fig. 1. The red region represented positive electrostatic potential and showed the electrophilic property, while the blue negative region was more nucleophilic.

The electrostatic potential map of RGO is shown in Fig. 1a, where homogeneous electron density with an average value of  $-24.15 \text{ kcal mol}^{-1}$  was found, and abundant  $\pi$  electrons were present. It was proposed that the  $\pi$ - $\pi$  electron-donor-acceptor (EDA) interactions and van der Waals forces were most likely to occur between the RGO and TCs due to their large ring structure;<sup>51</sup> while for the GO, although the presence of oxygen-containing functional groups weakened the  $\pi$ -electron activity because of the high fraction of  $\text{sp}^3$  C atoms, it may also introduce possible hydrogen bonds with TC molecules. As seen

in Fig. 1b, the maximum negative electrostatic potential ( $-47.19 \text{ kcal mol}^{-1}$ ) appeared around the O atom which was an active site when GO interacted with other substances.

As shown in Fig. 1c, there are nine positive electrostatic potential regions on the surface of the tetracycline molecules namely, H1, H2, ..., H8 and Cl which can serve as the binding sites with a negative O atom on the GO surface. The specific values of these active sites on TCs are shown in Fig. 1 and Table S1.† It's worth mentioning that the electrostatic potential value of each H5 atom ( $56.27 \text{ kcal mol}^{-1}$  for TTC,  $57.18 \text{ kcal mol}^{-1}$  for OTC and  $63.26 \text{ kcal mol}^{-1}$  for CTC) was the largest among all of the possible active sites. Therefore, theoretically, the H5 site is supposed to most likely interact with the GO surface and we will discuss this in the next section.

#### 3.2. Binding configuration

**3.2.1 RGO\_TC complexes.** From the above discussions, the RGO surface was rich in free  $\pi$ -electrons that have high van der Waals affinity with the aromatic ring of TCs. Thus accordingly, we considered parallel configurations of TC molecules onto the plane of the RGO, and we denoted them as [RGO\_TC] (TCs here could be TTC, OTC or CTC). The

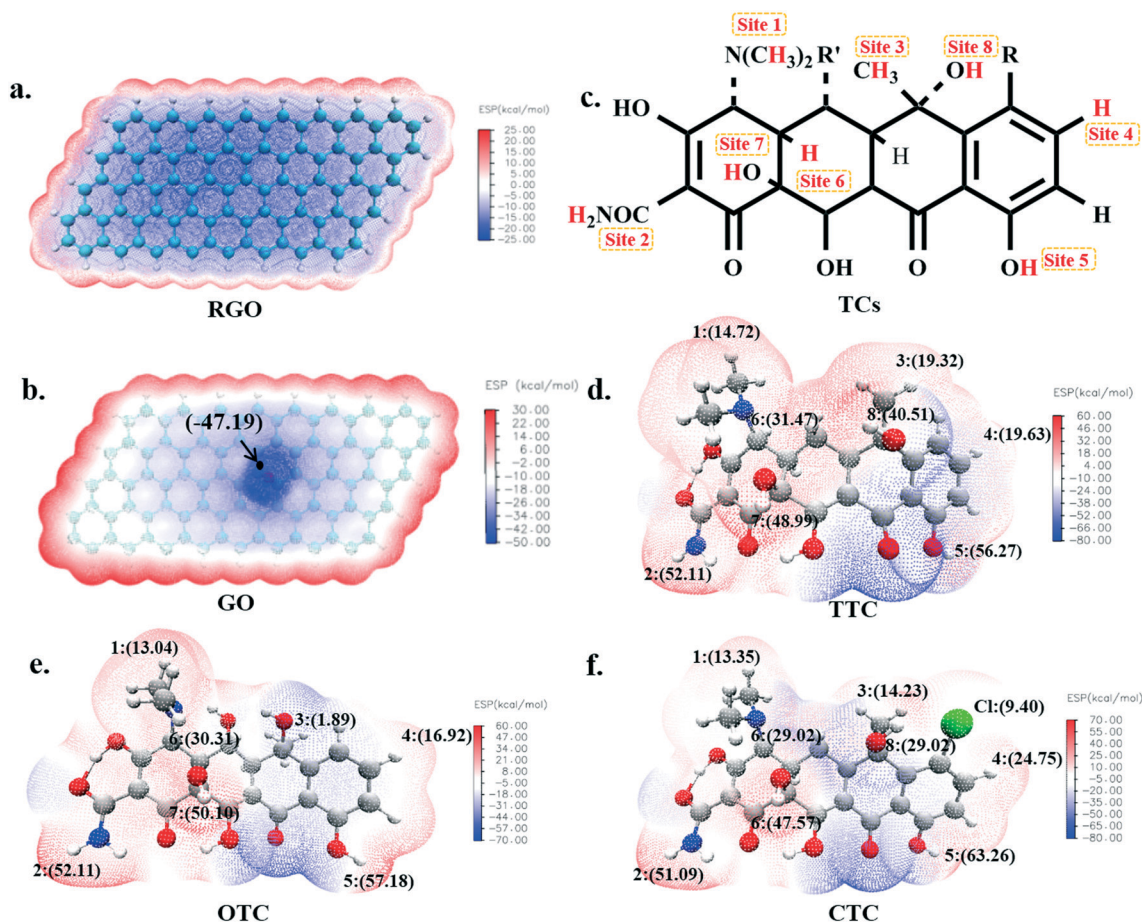


Fig. 1 The electrostatic potential (ESP) distribution of RGO (a), GO (b), TTC (d), OTC (e) and CTC (f); the possible adsorption sites (positive ESP regions) on the surface of tetracycline molecules (c).

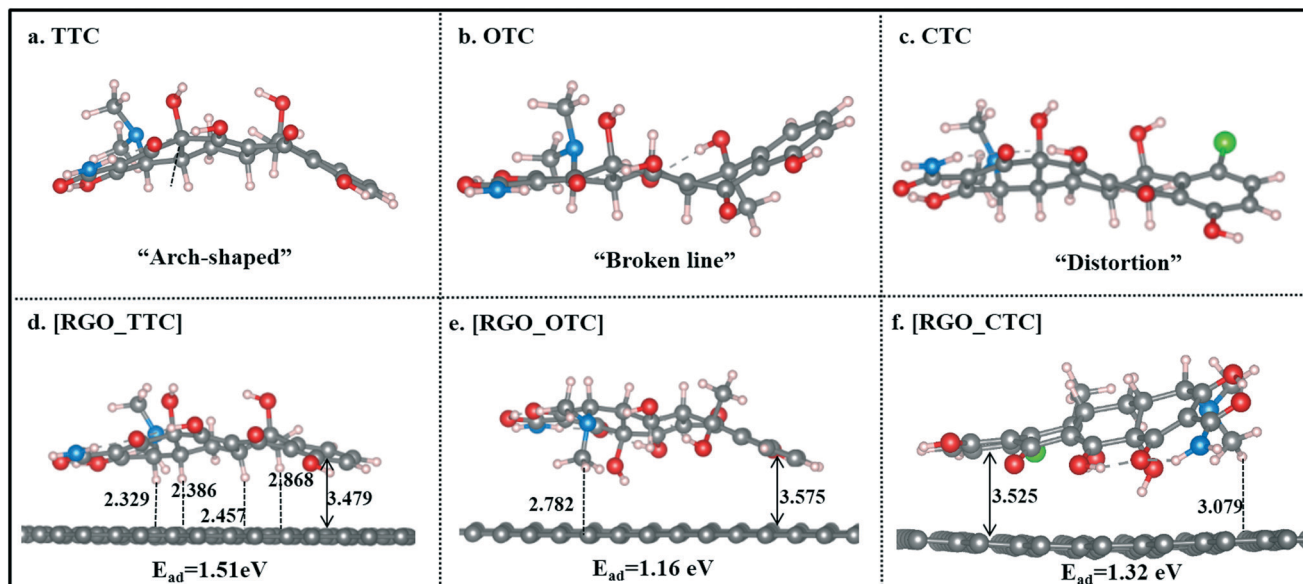


Fig. 2 The optimized geometries of TC molecules and RGO\_TC systems, bonds are in Å (the vertical distance refers to the distance between the centroid of benzene of TCs to the carbon plane of RGO).

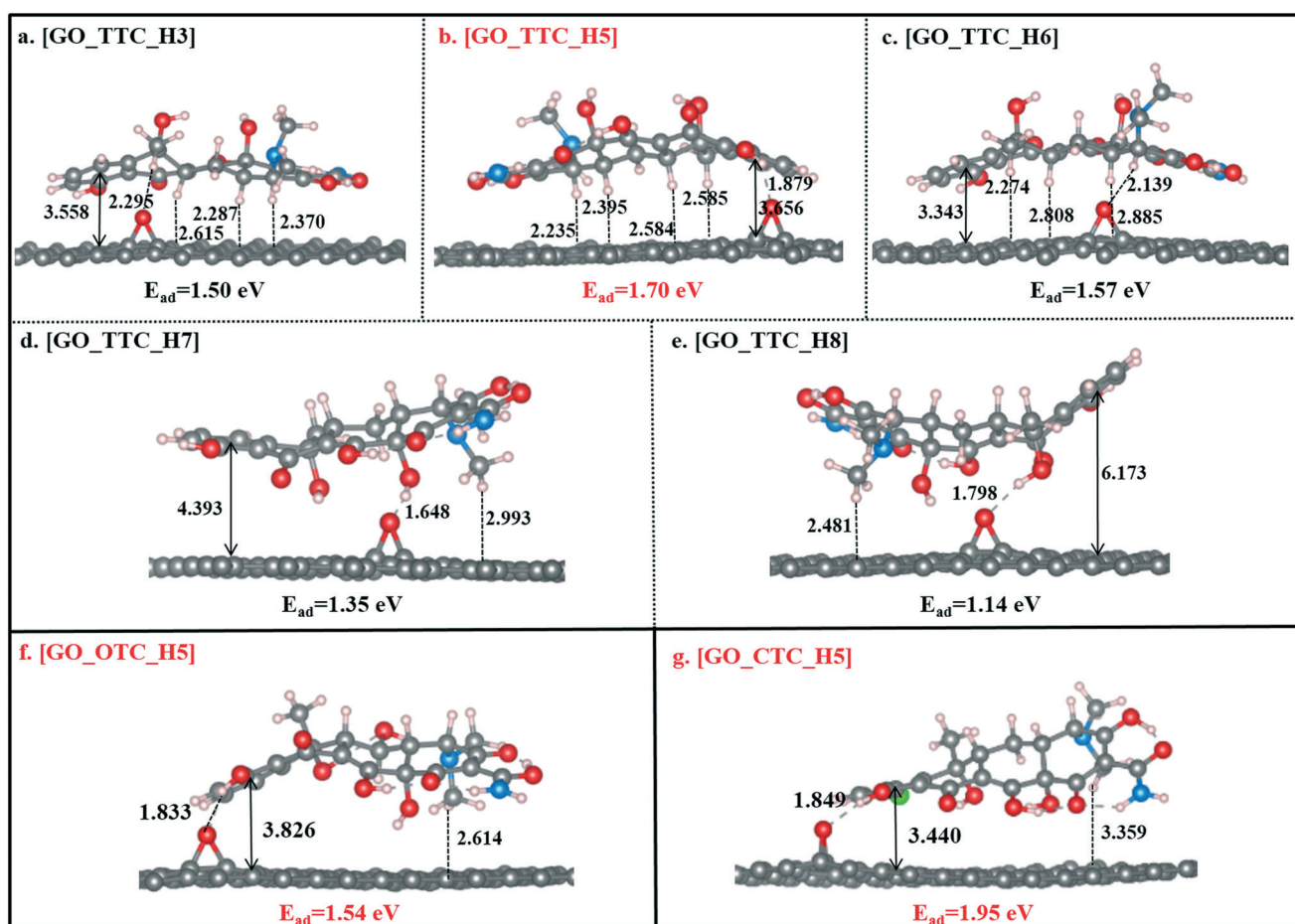


Fig. 3 The optimized geometries of GO\_TTC, GO\_OTC, and GO\_CTC complexes, bond lengths are in Å (the vertical distance refers to the distance between the centroid of benzene of TCs to the basal plane of GO).

optimized structures of RGO\_TC complexes and their adsorption energies are shown in Fig. 2.

Single TC molecules present quite different configurations as shown in Fig. 2a–c. TTC was in “arch” shape, and OTC showed a “broken line” shape, while the CTC molecule was distorted. The different configurations of these three TC molecules lead to the difference in interaction strength when they adsorbed on RGO. As shown in Fig. 2d–f, TCs lie flat on the surface and the vertical distance between the aromatic ring (denoted as  $D_v$ ) and the RGO surface is 3.479 Å, 3.575 Å, and 3.525 Å for TTC, OTC, and CTC, respectively. The distance followed the order [RGO\_TTC] < [RGO\_CTC] < [RGO\_OTC]. This demonstrated that the adsorption ability of RGO towards the three kinds of TC molecules was in the order TTC > CTC > OTC. We can draw the same conclusion from the adsorption energy results. Meanwhile, the distance between the H atoms of TCs and the carbon plane was also labeled in Fig. 2. The C–H... $\pi$  interaction may also contribute to the adsorption mechanism.

**3.2.2 GO\_TTC complexes.** Compared to the RGO, due to the oxygen-containing functional groups on GO, in addition to the  $\pi$ - $\pi$  interactions, the adsorption of the TTC molecule on the surface of GO is also promoted by the hydrogen bond between them. Herein, we studied eight GO\_TTC configurations in total with the binding sites of H1 to H8 in Fig. 1c, and the complexes are named [GO\_TTC\_HX] ( $X = 1, 2, \dots, 8$ ). We optimized the stable geometries for these complexes and two kinds of structures have been obtained. For H1, H2, and H4, the binding sites were somehow ineffective because the epoxy group was taken away by the TTC molecule through chemical reactions (Fig. S2<sup>†</sup>). Only for H3 and H5–H8 that the TTC molecule was effectively adsorbed on the GO surface (Fig. 3a–e).

As shown in Fig. 3b, [GO\_TTC\_H5] exhibited the highest adsorption energy of 1.70 eV in all the complexes, which was attributed to the strong  $\pi$ - $\pi$  EDA interaction and hydrogen bond effect. In detail, for [GO\_TTC\_H5], the distance between H5 and the O atom (denoted as  $O_{GO}$ ) on the surface of GO was 1.879 Å, and the vertical distance between the aromatic ring of TTC and the GO surface was 3.656 Å. In Fig. 3a and c, the  $O_{OG}$ -H3 and  $O_{OG}$ -H6 bond lengths were 2.295 Å and 2.139 Å, respectively, and the weaker hydrogen bond led to smaller adsorption energies as compared with [GO\_TTC\_H5]. In addition to the hydrogen bonds, the  $\pi$ - $\pi$  interaction was also important and decisive which can be deduced from the comparison between [GO\_TTC\_H5] and [GO\_TTC\_H7] (or [GO\_TTC\_H8]). The vertical distance between the aromatic ring of TTC and the GO surface in [GO\_TTC\_H7] was 4.393 Å, and it was 6.173 Å in [GO\_TTC\_H8]. The arched structure of the TTC molecule largely weakened the  $\pi$ - $\pi$  EDA interaction between the TTC molecule and GO. Although strong hydrogen bonds existed in [GO\_TTC\_H7] and [GO\_TTC\_H8], the  $E_{ad}$  for these two complexes was much smaller than that for [GO\_TTC\_H5]. Thus, based on the above discussion, we can conclude that the interaction between GO and TTC relied on the hydrogen bonds and  $\pi$ - $\pi$  interactions, while the latter

one should be the decisive effect. On the other hand, the favorable binding site of TTC was H5, which was consistent with the above ESP results.

**3.2.3 GO\_OTC and GO\_CTC complexes.** For the adsorption of OTC on GO, we studied seven systems denoted as [GO\_OTC\_HX] ( $X = 1, 2, \dots, 7$ ) where  $X$  represents the different binding sites of OTC. The computed geometries and the  $E_{ad}$  are presented in Fig. 3f and S3<sup>†</sup>. Similar to the TTC complexes, the most effective adsorption site was located at the H5 atom and the adsorption energy for [GO\_OTC\_H5] was 1.54 eV. By investigating into the detailed structural parameters in Fig. 3f, we found that its smaller adsorption energy (as compared to [GO\_TTC\_H5]) was due to the weaker  $\pi$ - $\pi$  interaction ( $D_v = 3.826$  Å) between GO and OTC, which further proved the above conclusion that the  $\pi$ - $\pi$  interaction was the decisive force in the adsorption process.

Fig. 3g and S4<sup>†</sup> show the different optimized structures of GO\_CTC complexes with H and Cl atoms. As shown in Fig. 3g, the  $D_v$  of [GO\_CTC\_H5] was only 3.440 Å, indicating a strong  $\pi$ - $\pi$  interaction between GO and CTC. The binding energy of [GO\_CTC\_H5] was then up to 1.95 eV, which was higher than those of [GO\_TTC\_H5] and [GO\_OTC\_H5] systems. Thus, the overall consideration of the binding configuration and adsorption energy makes us conclude that the adsorption ability of GO towards TCs followed the order CTC > OTC > TTC. Specifically, here we also optimized the GO\_OTC structure with the binding site of CTC being the Cl atom and the  $E_{ad}$  was calculated to be 1.35 eV (seen in Fig. S4g<sup>†</sup>). However, due to the repulsion between the electron-rich GO and Cl atom, the adsorption of the CTC molecule in this situation also mainly depended on the  $\pi$ - $\pi$  interaction and hydrogen bonds.

**3.2.4 Density of states.** The total density of states (TDOS) and partial density of states (PDOS) of the GO\_TC and RGO\_TC were calculated and are shown in Fig. 4 and S5–S7<sup>†</sup>, respectively. Herein, we took [GO\_TTC\_H5] and [GO\_TTC\_H7] as examples to elucidate the interaction between GO and TCs. Firstly, the obvious hybridization (the orange shadows in Fig. 4) between the PDOS of GO and TTC indicated that a strong interaction existed between GO and TTC. Meanwhile, different interaction sites reflect differences in hybridization also. By comparing specific PDOS peaks of [GO\_TTC\_H5] and [GO\_TTC\_H7], we can find that more hybridization areas (–7 eV, –5.8 eV and so on) existed in the former system, indicating that greater interaction occurs at the H5 site. The DOS plots of the GO\_OTC and GO\_CTC systems shown in Fig. S6 and S7<sup>†</sup> also presented the same trend.

### 3.3. The effect of the pH value on the adsorption process

Former experimental studies stressed that the pH value of the solution was the most important factor in the adsorption process of TTC onto graphene-based materials and low pH conditions are preferred.<sup>19</sup> Thus, in this section, we took the TTC molecule for instance to investigate its adsorption

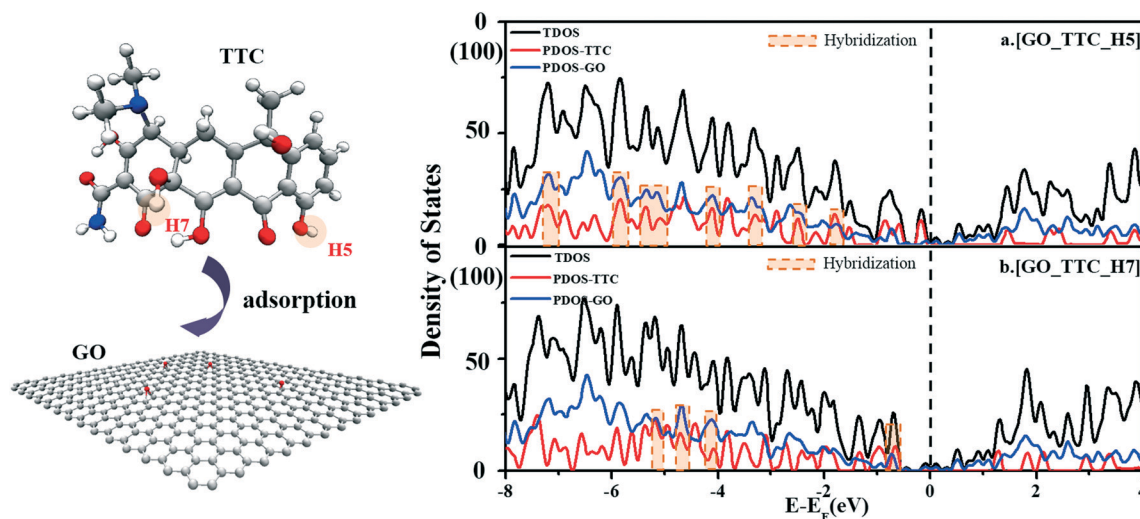


Fig. 4 The density of states of the GO\_TTC systems as the active sites of TTC was H5(a) and H7(b), respectively. The black lines represent the TDOS of GO\_TTC; the red and blue ones represent the PDOS of TTC and GO in these complexes, respectively.

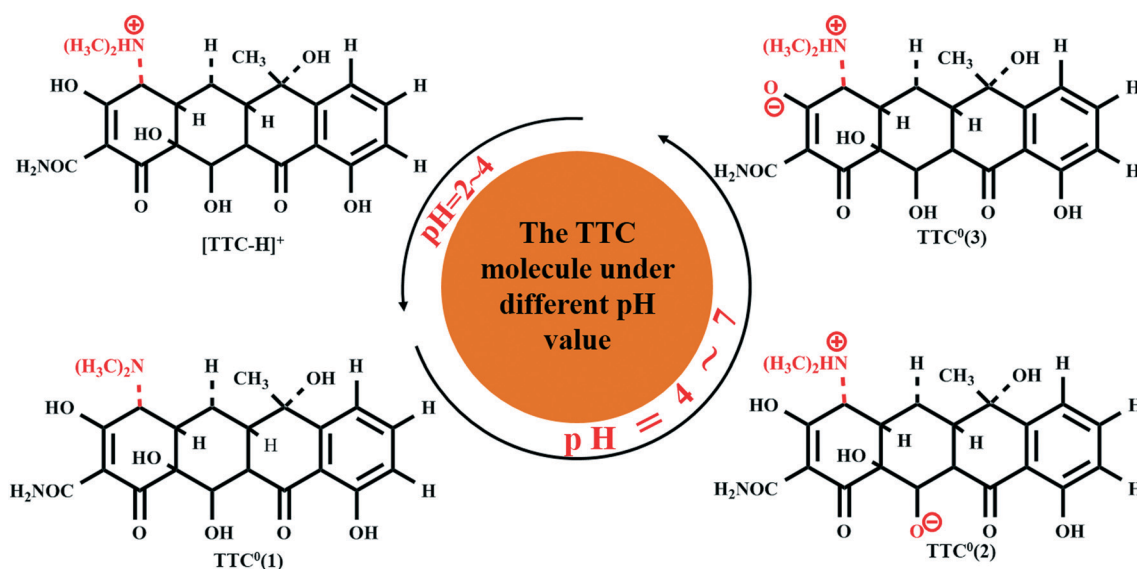


Fig. 5 The possible forms of the TTC molecule under different pH conditions.

process under low pH conditions covering a range of 2–7. According to the experimental results, the TTC molecule existed in the fully protonated form when the pH value was less than 4, while it was in the form of zwitterion ( $\text{TTC}^0$ ) when the pH was in the range of 4–7 as seen in Fig. 5.<sup>10,19</sup> The zwitterion forms included three possible patterns:  $\text{TTC}^0(1)$  (the model we have discussed above),  $\text{TTC}^0(2)$  and  $\text{TTC}^0(3)$ .<sup>52</sup>

The optimized structures of  $\text{TTC}^0(2)$ ,  $\text{TTC}^0(3)$  and  $[\text{TTC-H}]^+$  as well as their complexes with RGO are shown in Fig. 6. The remarkable change in the geometry of  $\text{TTC}^0$  molecules after adsorption lay in the molecular planarity from the initial arch-shaped molecule to parallel  $\pi$ - $\pi$  interactions with the RGO surface. This can be reflected in the short  $D_v$  values (3.498 Å in  $\text{TTC}^0(2)$  and 3.506 Å in  $\text{TTC}^0(3)$ ), and the

adsorption energies of  $[\text{RGO\_TTC}^0(2)]$  and  $[\text{RGO\_TTC}^0(3)]$  were 1.38 eV and 1.43 eV, respectively. On the other hand, as shown in Fig. 6f, when the pH of the solution was less than 4, the tetracycline molecule was in the fully protonated state, and the vertical distance was only 3.324 Å which was much shorter than that of the  $[\text{RGO\_TTC}^0]$  systems (3.479–3.506 Å). The configurational change was accompanied by the enhancement of the adsorption energy which was 3.27 eV for  $[\text{RGO\_TTC\_H}]^+$ , indicating that the acidic environment was favorable for the adsorption process. The significant improvement of the adsorption energy may be due to not only the reinforcement of  $\pi$ - $\pi$  interaction, but also the cation- $\pi$  bonding occurring between the protonated amino group of TTC and the  $\pi$ -electron-rich aromatic structure of GO. Besides, there was an obvious charge transfer between

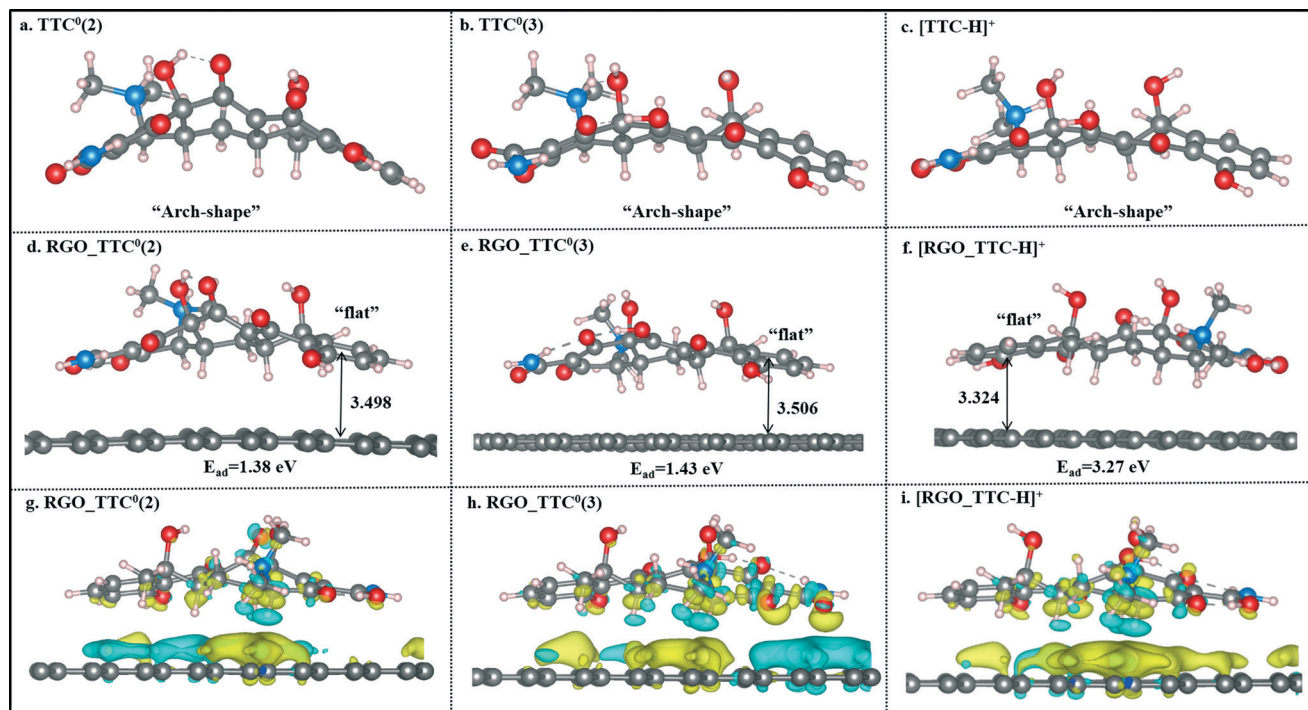


Fig. 6 The optimized geometries of  $\text{TTC}^0(2)$  (a),  $\text{TTC}^0(3)$  (b),  $[\text{TTC-H}]^+$  (c),  $[\text{RGO\_TTC}^0(2)]$  (d),  $[\text{RGO\_TTC}^0(3)]$  (e),  $[\text{RGO\_TTC-H}]^+$  (f), and the charge density difference plots of  $[\text{RGO\_TTC}^0(2)]$  (g),  $[\text{RGO\_TTC}^0(3)]$  (h),  $[\text{RGO\_TTC-H}]^+$  (i) systems.

RGO and TTC molecules in the charge density difference plots as shown in Fig. 6g–i, which further elucidated the interaction between RGO and TTC molecules.

We also investigated the effects of the pH value on the adsorption of TTC molecules on the GO surface. According to the discussion above, we can conclude that the H5 site was the active site of tetracyclines. Thus, for comparison, we also selected the H5 site as the active site of the TTC molecule in the model of protonation and the other two zwitterion forms. As seen in Fig. 7, compared with the RGO results above, there has been a slight increase in the binding energies. Such an enhancement could be explained by the hydrogen bonds between the GO surface and the TTC molecules. Besides, the protonation states  $[\text{TTC-H}]^+$  still exhibit superior capability in adsorption compared to the zwitterion forms, as reflected in the  $E_{\text{ad}}$  values shown in Fig. 7. This phenomenon was apparently present in the  $[\text{GO-H\_TTC-H}]^+$  system where both the TTC and GO were protonated. It has the highest  $E_{\text{ad}}$  value of 3.86 eV and remarkable charge transfer as seen in Fig. 7g and h. Consequently, the low pH value is beneficial to the protonation of TTC molecules and will induce the cation- $\pi$  interaction between the adsorbates and sorbents.

### 3.4. Effect of the solvents

In this work, we also investigated the influence of the solvents on the adsorption capacity. Three types of solvents with different relative permittivity values were chosen here, such as ethanol ( $\epsilon = 24.3$ ), acetonitrile ( $\epsilon = 37.5$ ), and water ( $\epsilon = 80.0$ ) to compare with the vacuum ( $\epsilon = 1.0$ ) phase.  $\Delta E_{\text{solvation}}$

is the relative energy difference of GO\_TC (or RGO\_TC) systems in a vacuum and these solvents:

$$\Delta E_{\text{solvation}} = E_{\text{ad}}(\text{solvent}) - E_{\text{ad}}(\text{vacuum})$$

where  $E_{\text{ad}}(\text{solvent})$  and  $E_{\text{ad}}(\text{vacuum})$  correspond to the adsorption energies of the complexes as defined above in solvent and the vacuum, respectively. What can be clearly seen in Fig. 8 is the negative value of 0.1–0.5 eV for  $\Delta E_{\text{solvation}}$ , which illustrates that the solvent would have a negative effect on the adsorption energy somehow. Such an impact came forth greater along with the increase of the dielectric constant of the solvent as shown in Fig. 8. Tetracyclines possess various oxygen-containing groups which offer plenty of complexation sites for the solvent. Thus, the interaction with the solvent will be reduced to some extent in terms of the adsorption capacity. Another notable result to emerge from the data is that the solvent effect has a greater influence on the GO\_TCs compared to that on the RGO\_TCs, indicating the important roles of the oxygen-containing groups on GO surfaces which may form hydrogen bonds with the polar solvent molecules. However, the detailed interaction mechanism with solvent molecules needs to be elucidated by further studies, probably by using an explicit solvent model in future work.

### 3.5. Molecular dynamics simulations

Fig. 9a–c show the summary statistics for the minimum distance between the different TCs and GO over time. From



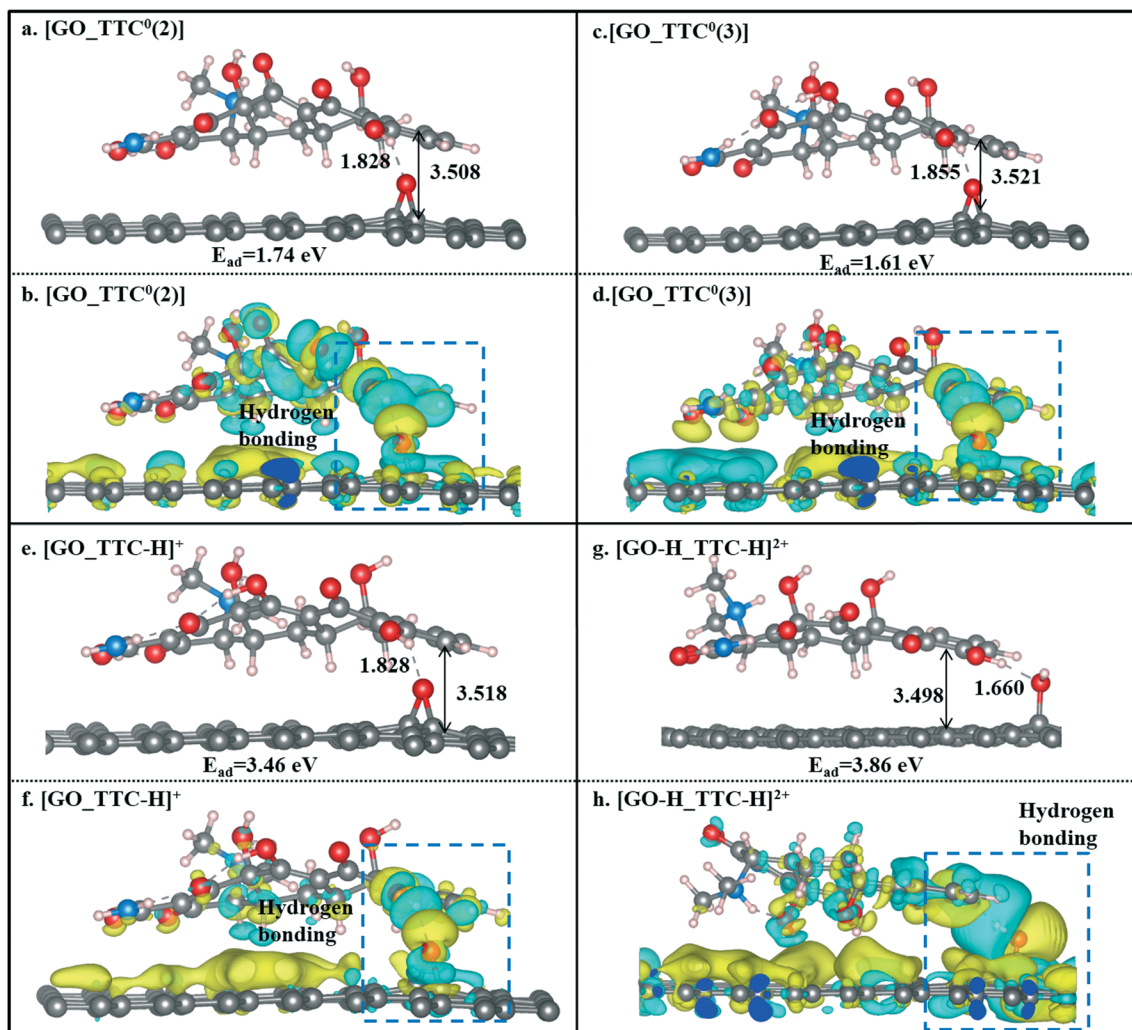


Fig. 7 The optimized geometries of [GO\_TTC<sup>0</sup>(2)] (a), [GO\_TTC<sup>0</sup>(3)] (c), [GO\_TTC-H]<sup>+</sup> (e), and [GO-H\_TTC-H]<sup>2+</sup> (g) systems and their charge density difference plots (b, d, f and h).

the graph we can see that the final equilibrium distance for the adsorption of TCs toward GO is around 0.3 nm. However,

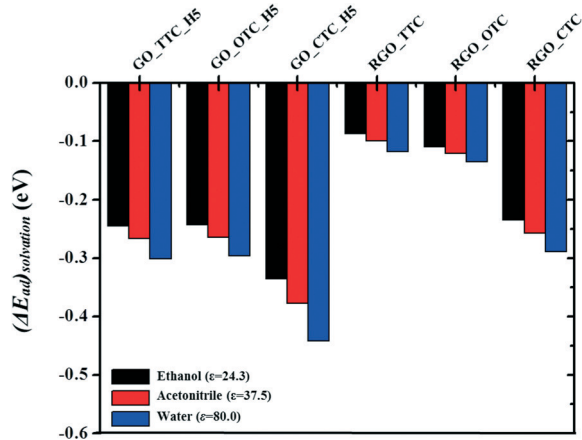


Fig. 8 The solution effect ( $\Delta E_{\text{solvation}}$ ) in different solvents for GO\_TC and RGO\_TC systems.

a small number of exceptions exist in the TTC and OTC systems exhibiting an equilibrium range of 0.8–1.2 nm. If we look through the snapshots of the MD trajectory in Fig. S8,<sup>†</sup> these exceptions are on account of the intermolecular accumulation which stunted the effective adsorption. Hence, the dynamic interaction between the different TCs may have an influence on the adsorption. Besides, significant differences were found in the adsorption behavior of the TC molecules. The CTC molecules seem to be more competitive than the other TCs and reach the stable equilibrium within 20 ns. By contrast, due to the fast adsorption of CTC and the intermolecular interactions, there were slight fluctuations in the distances for the TTC and OTC systems.

The radial distribution functions (RDFs) and running coordination numbers are shown in Fig. 10. The first peak (about 0.5 nm) in Fig. 10a corresponds to the first adsorption layer which is the main adsorption layer. Accordingly, from Fig. 10b, in the simulation of the GO\_CTC system with 8 molecules of CTC, 7 molecules form the first layer and the last remaining CTC made the second layer. Comparatively, in

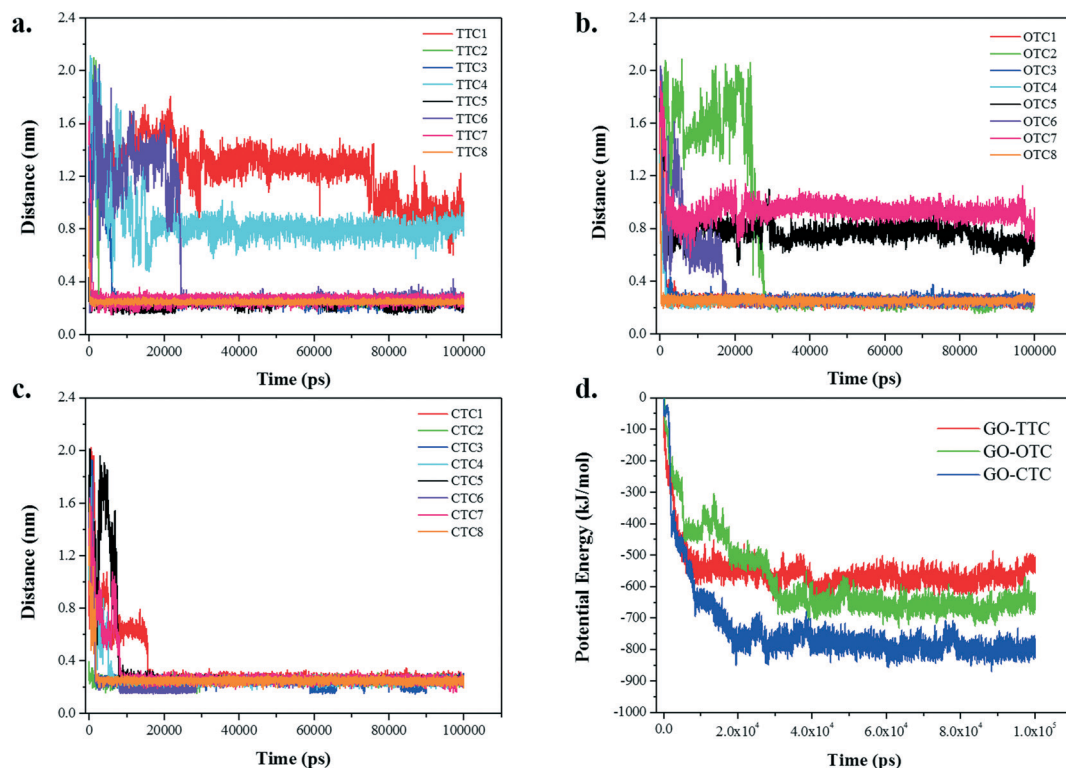


Fig. 9 (a–c) The minimum distance between TC molecules and GO; (d) the potential energy between GO and TCs.

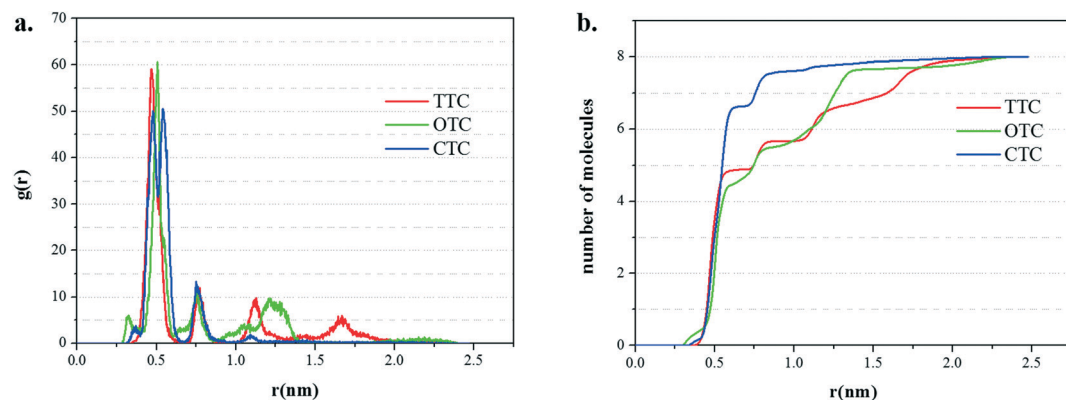


Fig. 10 (a) The radial distribution function (RDF) of the three TC molecules on the GO surface; (b) the running coordination numbers of the three TCs to the surface of GO.

Table 1 Coulomb interaction, vdW interaction and total potential energy of the TTC, OTC, and CTC molecules interacting with GO

Energy time	GO_TTC			GO_OTC			GO_CTC		
	Coulomb interaction (kJ mol <sup>-1</sup> )	vdW interaction (kJ mol <sup>-1</sup> )	Potential energy (kJ mol <sup>-1</sup> )	Coulomb interaction (kJ mol <sup>-1</sup> )	vdW interaction (kJ mol <sup>-1</sup> )	Potential energy (kJ mol <sup>-1</sup> )	Coulomb interaction (kJ mol <sup>-1</sup> )	vdW interaction (kJ mol <sup>-1</sup> )	Potential energy (kJ mol <sup>-1</sup> )
0 ns	0.01	-12.41	-12.40	0	0	0	2.31	-6.41	-4.10
20 ns	-15.58	-520.38	-535.97	-1.94	-457.56	-459.50	-19.98	-760.40	-780.38
40 ns	-8.85	-589.21	-598.06	-3.50	-604.69	-608.19	-4.86	-770.20	-775.07
60 ns	-10.97	-540.54	-551.51	-11.786	-660.61	-672.39	-20.47	-755.76	-776.23
80 ns	-21.32	-583.83	-605.15	-9.54	-646.47	-656.01	0.621	-794.88	-794.26
100 ns	-9.43	-515.74	-525.17	-12.10	-626.06	-638.16	-1.54	-766.34	-767.88

the first adsorption layer, the running coordination numbers of TTC and OTC are 5 and 4, respectively. These data also correspond to the slight fluctuations of TTC and OTC molecules in Fig. 9. Meanwhile, it can be found that GO shows more obvious adsorption ability for CTC molecules.

Fig. 9d shows the potential energies between GO and TC molecules over time together with the specific values of potential energy summarized in Table 1. As the simulation progresses, the interaction energy decreases rapidly in the initial 30 ns and then remains in equilibrium. The numerical values of the van der Waals (vdW) interaction in the GO\_TC systems accounted for more than 95% of the potential energies, which was much higher than the Coulomb interaction, indicating that the vdW interaction was the dominant force between GO and TC molecules.

MD simulations show that GO has superior adsorption performance towards the three TC molecules, especially excellent for CTC. Almost all TCs show good adsorption stability during the 100 ns simulations, and the adsorption is mainly concentrated in the first adsorption layer. The adsorption of the GO\_TC systems are through the Coulomb interaction and vdW interaction, and the vdW interaction is the dominant force.

## 4. Conclusion

In summary, in this article, the adsorption behavior and interaction mechanisms of TC molecules on RGO and GO were investigated by both the DFT method and MD simulations. Firstly, the DFT results showed that the adsorption performance of GO towards three TC molecules was stronger than that of RGO, and the adsorption energies followed the order CTC > TTC > OTC and TTC > CTC > OTC for the GO and RGO systems, respectively. Static calculations also confirmed that the preferential adsorption site of TCs is located on H5 when interacting with GO. Meanwhile, the adsorption mechanism was examined and the  $\pi$ - $\pi$  EDA interaction and hydrogen bonds were found to play significant roles in the GO\_TC systems. In the meantime, we also propose that C-H $\cdots$  $\pi$  interaction may contribute to the adsorption mechanism, although it is much weaker than other chemical interactions. Regarding the effects of the pH value and solvent on the adsorption process, the computed results showed that low pH values were suitable for the adsorption of TCs on GO (or RGO) due to the reinforced  $\pi$ - $\pi$  EDA interaction, hydrogen bonds and cation- $\pi$  interaction. And low polarity solvents were verified to be more beneficial to the adsorption process. Finally, MD simulations showed that a competitive adsorption process existed in TCs and the CTC molecules displayed the most competitive ability towards the GO material. Besides, the dominant force in the dynamic adsorption process was the van der Waals interactions. This work can offer new insights into the knowledge gaps in the microscopic binding configuration, molecular-scale mechanism and competitive adsorption behavior during the adsorption process of TCs

onto graphene-based materials. Our results are helpful in making the experimental design goal-oriented and may provide a theoretical basis for the removal of tetracycline antibiotics in the environment.

## Conflicts of interest

There are no conflicts to declare.

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