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# Can endohedral transition metals enhance hydrogen storage in carbon nanotubes?

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## Abstract

The safe and efficient use of hydrogen energy, which is in high demand worldwide today, requires efficient hydrogen storage. Despite significant advances in hydrogen storage using carbon-based nanomaterials, including carbon nanotubes (CNTs), efforts to substantially increase the storage capacity remain less effective. In this work, we demonstrate the effect of endohedral transition metal atoms on the hydrogen storage capacity of CNTs using reactive molecular dynamics simulations. We find that an increase in **the volume fraction** of endohedral nickel atoms leads to an increase in the concentration of physisorbed hydrogen molecules around single-walled CNTs (SWNTs) by approximately **1.6 times** compared to pure SWNTs. The obtained results provide insight into the underlying mechanisms of how endohedral transition metal atoms enhance the hydrogen storage ability of SWNTs under nearly ambient conditions.

## keywords

hydrogen energy, hydrogen storage, carbon nanotube, endohedral metal atoms, reactive molecular dynamics, hydrogen adsorption.

## Introduction

Hydrogen energy is currently regarded as a highly promising renewable energy source due to its environmental friendliness and high efficiency [1-3]. One of the most important challenges in hydrogen energetics is the safe and efficient storage of hydrogen atoms/molecules [3-11]. Various traditional methods of hydrogen storage [12], including compression [13], liquefaction [11,14], physisorption [15,16], hydrides [9,10,17,18] and other methods [2,7,8,15,19,20], are currently being investigated. Nevertheless, the issue of the effective use of hydrogen on a large scale remains a crucial problem that needs to be addressed [1,5,21]. In particular, the storage of compressed and liquified hydrogen is inappropriate for large-scale use due to its low density and high cost at high pressures as well as boiling-off issues at room temperature [3,5,12,21]. In this respect, metal hydrides have the ability to store hydrogen with a high volumetric density [10,17]. However, their gravimetric density is limited due to the presence of heavy transition metals [21]. Moreover, the process of hydrogen absorption, desorption, and release in metal hydrides requires high temperatures and significant energy input [21]. In contrast, complex hydrides possess remarkably high volumetric and gravimetric densities [9,18]. Still, their melting points are in close proximity to cryogenic temperatures (around 200 K), causing them to exist in a liquid phase at room temperature [21].

In recent decades, the physisorption of hydrogen on and in porous materials has been developed to solve the above problems [7,15,16,22,23]. Most of the research related to this method uses metal-organic frameworks (MOFs) [6,19,22,24,25] and various carbon-based nanostructures [8,20,23,26-28] as porous materials. These materials are currently being studied to improve their hydrogen storage capacity by increasing the absorption and adsorption rates of hydrogen atoms or molecules [29]. Carbon-based nanomaterials are especially interesting candidates for hydrogen storage due to their low weight and chemical stability [30-32]. In particular, carbon nanotubes (CNTs) [33] have been proposed as efficient hydrogen storage materials due to their unique properties, such as low density and large surface area [7,28,34-36]. Consequently, significant research has been conducted on hydrogen storage using single- [7,26,37-40] and multiwalled CNTs [30,31,40-42]. Various studies have shown that physisorbed and chemisorbed hydrogen species can be stored in CNTs at gravimetric densities of 0.1–6.3 wt.% and pressures of 0.01–20 MPa [26,27,34,39,40,43-48]. Although CNTs appear to be more efficient at storing hydrogen than metal hydrides, the storage pressure in CNTs is approximately 5 to 10 times higher, resulting in increased storage costs.

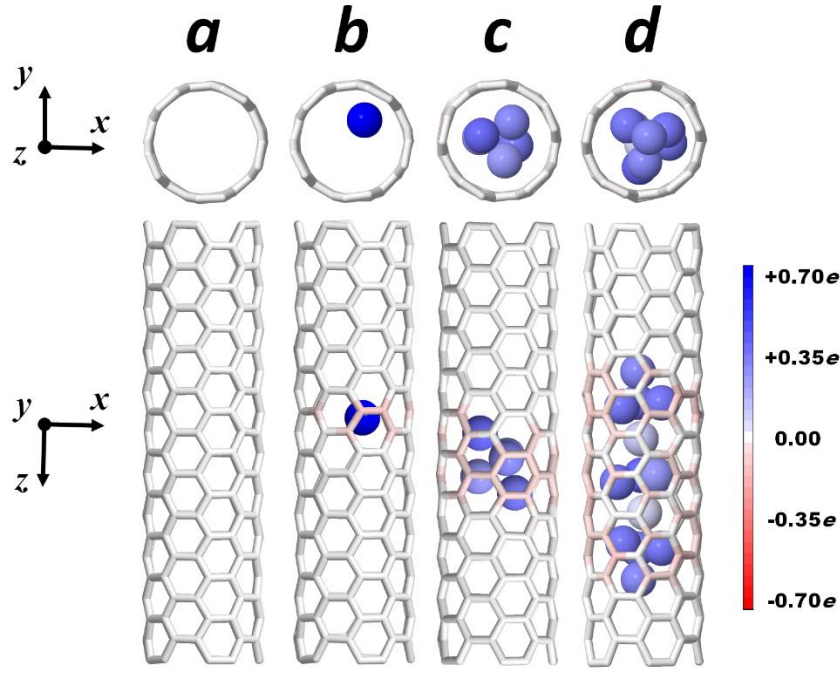
Alternatively, various transition metal nanocatalysts adsorbed on the CNT surface are also considered for hydrogen storage [36,42,47,49]. Using this method, the effective storage of hydrogen atoms on the CNT surface due to the chemical dissociation of hydrogen molecules by adsorbed nanocatalysts is being intensively studied [36,42]. In particular, transition metal-doped CNTs can

store hydrogen at gravimetric densities in the range of 3.0 - 7.0 wt.% at a pressure of approximately 0.1 MPa [36]. Despite the high storage capacity achieved even at low hydrogen pressures, the disadvantage of the method is the chemical instability of transition metal-doped CNTs [36]. For instance, an increase in the concentration of Ni nanoparticles on the surfaces of single-walled CNTs (SWNTs) (from 0 to 8 wt.% Ni) leads to an increase in the concentration of chemisorbed H atoms (from 1.61 to 5.25 wt.%), a further increase in the concentration of nickel (12 wt.% Ni) sharply reduces the hydrogen storage capacity of SWNTs (2.99 wt.%), which was explained by the blocking effect due to the association of Ni nanoparticles on the surfaces of SWNTs [47]. On the other hand, this phenomenon can also be associated with a change in the physical properties of the SWNT surface caused by the nanocluster binding nature due to the confinement effect [50]. Because of this effect, endohedral metal atoms bind weakly to the interior of the SWNT wall compared to those adsorbed on the outside of the SWNT, regardless of their catalytic activity [50,51]. Thus, transition metal atoms can form nanoclusters [52-54] or nanowires [55,56] inside a CNT instead of being located separately in the interior [57]. This has resulted in the thorough investigation of the chemical vapor deposition (CVD) growth of these nanoclusters and nanowires inside SWNTs [58], as well as their resulting electronic and magnetic properties [55,56]. Nevertheless, to the best of our knowledge, studies on hydrogen storage on the surface of SWNTs using endohedral transition metals have not yet been conducted.

In this study, we explore for the first time the role of an endohedral transition metal (namely, nickel) in enhancing the hydrogen storage capacity of SWNTs under ambient conditions, i.e., room temperature and atmospheric pressure, by reactive molecular dynamics (MD) simulations.

### Computational details

The process of hydrogen storage on SWNTs with endohedral Ni atoms is investigated by employing reactive MD simulations using the LAMMPS package [59]. To describe interatomic interactions in the system, the ReaxFF potential with a previously validated parameter set developed by Mueller is used [60]. In the simulations, a pristine (5,5) nanotube and a (5,5) nanotube with endohedral Ni atoms at different concentrations (i.e., Ni<sub>n</sub>@SWNT, where  $n=0, 1, 5, 13$ ) are selected as model SWNTs (Fig. 1). The diameter of the SWNTs is 6.93 Å, which is within the range of experimentally obtained nanotube diameters (6.3–7.9 Å) [61]. Periodic boundary conditions are applied along the z-axis, which represents the length of the SWNT (27.25 Å), allowing the simulation of infinitely long SWNTs.



**Figure 1.** Top and side views of (a) pristine SWNT, (b) Ni@SWNT, (c) Ni<sub>5</sub>@SWNT, and (d) Ni<sub>13</sub>@SWNT. SWNT and Ni atoms are represented in sticks and balls, respectively. The system atoms exhibit partial charges ranging from  $-0.7e$  to  $+0.7e$ , depicted by a color spectrum from red to blue, indicating the conversion from electron-rich to electron-poor regions.

As a result, the filling or volume fraction of endohedral Ni atoms in the SWNT is used (instead of their concentration); hence, this fraction is independent of the length of the SWNT. The volume fraction of endohedral Ni atoms inside SWNT is calculated by dividing the average volume of Ni atoms by the effective volume of SWNT (in %). The average volume of each Ni atom is determined using the van der Waals radius, which is approximately  $1.63 \text{ \AA}$  [62]. The effective volume of SWNT is calculated using the concept of the effective diameter [63], i.e.,  $d_{eff} = d_{geo} - \sigma_{C-Ni}$ , where  $d_{eff}$  is the effective diameter of the SWNT,  $d_{geo}$  is the geometric diameter of the SWNT (i.e.,  $6.93 \text{ \AA}$ ), and  $\sigma_{C-Ni}$  is the sigma bond length of C–Ni (i.e.,  $2.5 \text{ \AA}$ ). According to this formula, the inner volume fraction of the nanotube filled by Ni atom, Ni<sub>5</sub>, and Ni<sub>13</sub> clusters is estimated to be approximately 4, 22, and 56%, respectively. We use these volume fractions instead of the number of Ni atoms inside SWNT to compare our results with experimental data.

**Initially**, the energy of all model systems is minimized by the conjugated gradient method. Subsequently, the temperature and pressure of the systems are equilibrated to the desired values (300 K and 0 Pa) in the  $NpT$  ensemble using a Berendsen thermostat and barostat [64] with coupling constants of 100 fs and 5000 fs, respectively. The chosen heating rate (i.e., 1 K/ps) corresponds to a

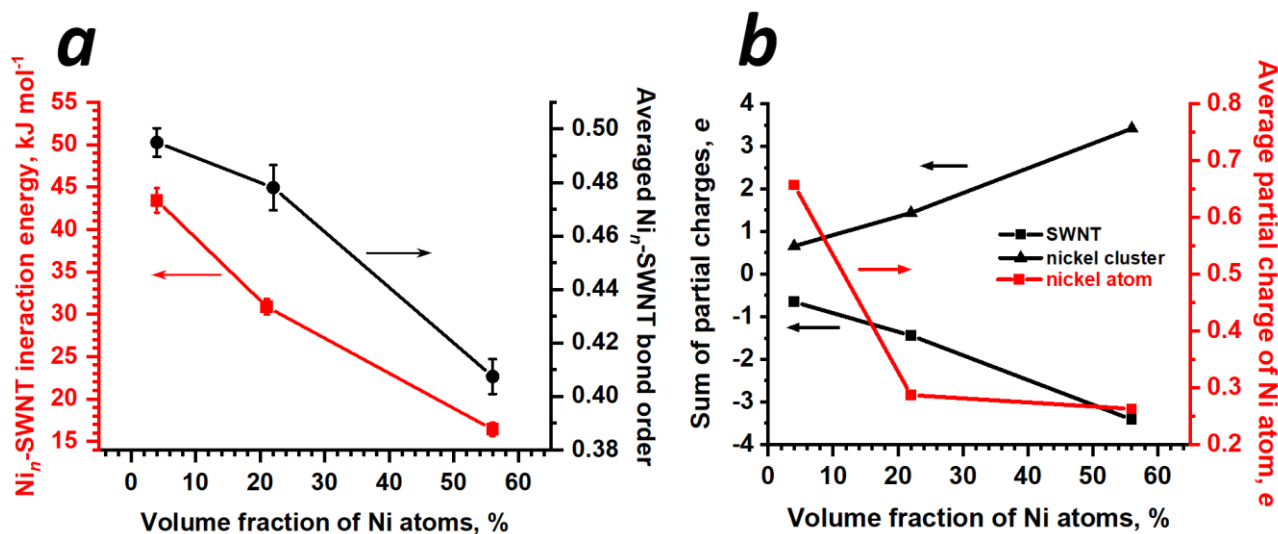
previously reported range of values (0.1 - 10.0 K/ps) [65,66] and indicates that the deviations in the thermodynamic equilibrium of the model systems are insignificant during the temperature increase. In the case of the physisorption of H<sub>2</sub> molecules on Ni<sub>*n*</sub>@SWNT (*n* ∈ 0, 1, 5 and 13), the system's temperature is kept at 300 K for 100 ps using a Bussi thermostat [67] with a coupling constant of 100 fs in the canonical *NVT* ensemble.

In the simulations, the pressure of H<sub>2</sub> molecules in the system is calculated as  $p = J\sqrt{2\pi MRT}/N_A$ , [68] where *J* is the impingement flux (nm<sup>-2</sup>·ns<sup>-1</sup>), *N<sub>A</sub>* is Avagadro's number, *R* is the universal gas constant, *M* is the molar mass of the H<sub>2</sub> molecule (kg·mol<sup>-1</sup>) and *T* is the temperature of the system (K). During the *NVT* simulations, H<sub>2</sub> molecules are introduced into the environment surrounding the nanotube surface (~ 5.34 nm<sup>2</sup>) at a time interval of 10 ps. The distance between each introduced H<sub>2</sub> molecule and the model system is chosen to be at least 10 Å (i.e., the cutoff radius of the interaction potential). Under these conditions, the impingement flux of the incident H<sub>2</sub> gas (consisting of 300 H<sub>2</sub> molecules) is 18.72 nm<sup>-2</sup>·ns<sup>-1</sup>, and its corresponding pressure is approximately 0.174 MPa. The total simulation time for the H<sub>2</sub> physisorption process lasts 3 ns. In all MD simulations, a time step of 0.1 fs is used. The simulations are repeated 5 times for each study case (resulting in a total of 40 simulations), and the final results are obtained by averaging the individual physical quantities.

## Results and discussion

**SWNT with endohedral Ni atoms.** Studying the interaction of endohedral Ni atoms with the inner surface of SWNT is important for a better understanding of the process of hydrogen storage using Ni<sub>*n*</sub>@SWNT. For this purpose, we evaluate the interaction energy of the endohedral Ni atoms with the interior of SWNT, which is defined as  $E = E_{Ni_n@SWNT} - (E_{Ni_n} + E_{SWNT})$ , where  $E_{Ni_n@SWNT}$ ,  $E_{Ni_n}$  and  $E_{SWNT}$  are the potential energies of Ni<sub>*n*</sub>@SWNT, Ni<sub>*n*</sub> cluster, and pristine SWNT, respectively [56,69]. Figure 2a shows this interaction energy as a function of the volume fraction of Ni atoms inside the SWNT (see red curve). The interaction energies are found to be -43.42±1.93, -30.88±0.96, and -16.40±0.96 kJ·mol<sup>-1</sup> for volume fractions of 4, 22, and 56%, respectively. This indicates that an increase in the volume fraction of endohedral Ni atoms results in a decrease in their interaction energies with the interior of the SWNT. A similar interaction behavior was obtained for the cases of Fe atom, Fe<sub>2</sub> dimer, and F<sub>1D</sub> nanowire with the inner wall of an (8,8) CNT, and the calculated DFT energies were found to be -77.19, -11.58, and -2.89 kJ·mol<sup>-1</sup> per Fe atom, respectively [51]. In general, the interaction behavior between the interior of the SWNT and the metal atoms belonging to the iron family depends on the type of metal. In particular, quantum mechanical calculations showed that the interaction energies of endohedral Co and Fe nanoclusters

with the interior of (5,5) nanotube are 1.22 and 1.44 times higher than the energy of Ni nanocluster at the same concentration [56].



**Figure 2.** (a) The absolute values of the negative interaction energy of endohedral Ni atoms with the interior of the SWNT (left, red curve) and the average bond order between Ni and C atoms (right, black curve) as a function of the volume fraction of Ni atoms. (b) The sum of the partial charges of SWNT and Ni atom/cluster (left, black curves) and the average partial charge of Ni atom (right, red curve) as a function of the volume fraction of endohedral Ni atoms.

The weakening of the interaction can also be seen by a decrease in the average bond order between Ni and C atoms (Fig. 2a, black curve). Indeed, the average bond order between Ni...C is  $0.495 \pm 0.005$ ,  $0.478 \pm 0.008$ , and  $0.407 \pm 0.006$  for volume fractions of Ni atoms of 4, 22, and 56%, respectively. It is thus clear that the interaction character between the Ni atoms and the inside wall is noncovalent.

The nature of the interaction between the Ni atom/cluster and the interior of the SWNT can be explained by the confinement effect [50,70] associated with a change in the curvature of the adsorbent surface [71]. In particular, twisting or bending graphene leads to a deformation of the  $\pi$  bonding, which causes the transfer of electrons from the concave side to the convex side, thereby leading to a different distribution of electrons inside and outside the SWNT [51,70,71]. Hence, this phenomenon and the addition of Ni atoms inside the SWNT together influence the partial charges of atoms in the system (see Fig. 2b and cf. Fig. 1). In particular, an increase in the volume fraction of Ni atoms leads to an increase in the magnitudes of the sum of the partial charges of the SWNT and Ni cluster, which are found to be between  $-0.5e$  and  $-3.5e$  and  $+0.5e$  and  $+3.5e$  (see black curves), respectively. However, the average partial charge of individual nickel atoms decreases from  $0.67e$  over  $0.29e$  to

0.27e for volume fractions of 4, 22, and 56%, respectively (see red curve), which is due to the formation and further strengthening (or an increase in the binding energy) of the Ni-Ni bonds. Indeed, according to quantum mechanical calculations, the binding energies of Ni<sub>2</sub>, Ni<sub>13</sub> and Ni<sub>55</sub> nanoclusters are found to be between 63.68-215.18, 260.53-411.05 and 338.69-440.97 kJ·mol<sup>-1</sup>, respectively [71]. Consequently, the electron density between the Ni atoms in the cluster increases, causing a decrease between the Ni and C atoms, eventually leading to a weakening of the interaction between SWNT and endohedral Ni atoms. Therefore, a sharp drop (~2.6 times decrease) in the average partial charge per Ni atom is observed (Fig. 2b, red curve) due to the “atom-to-cluster” transition.

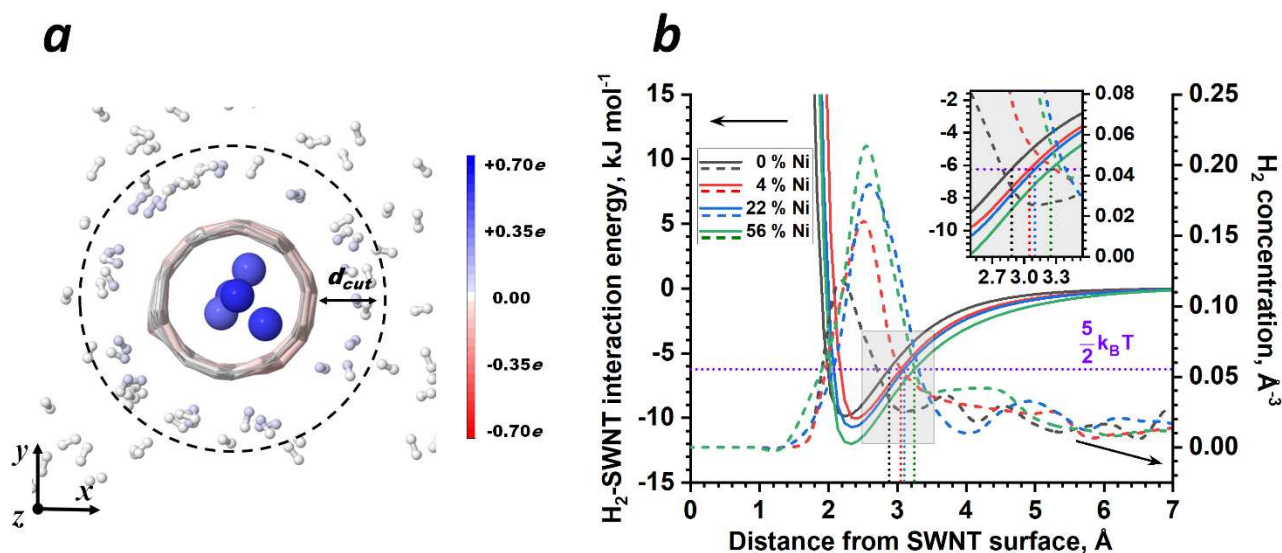
In addition, a decrease in the Ni···C interaction energy causes an increase in the mobility of Ni clusters [53,70] and hence most likely does not allow defect formation inside the SWNT by endohedral Ni atoms [53,72]. The simulation results also show that an increase in the volume fraction of Ni atoms leads to an increase in the number of C atoms with nonzero partial charges in the SWNT. In particular, the percentage of these carbon atoms is approximately 66, 86 and 99% for Ni volume fractions of 4, 22, and 56%, respectively. This indicates that a volume fraction of endohedral Ni atoms greater than 56% results in negative nonzero partial charges of almost all carbon atoms in SWNT.

**Hydrogen physisorption on SWNT with endohedral Ni atoms.** The study of hydrogen storage using SWNTs by physisorption of H<sub>2</sub> molecules is essential for understanding how to easily extract hydrogen to reuse it as an energy source [7,21]. In general, the physisorption of H<sub>2</sub> molecules on pristine SWNT depends strongly on its surface curvature (or diameter) [48,73] and metallicity effects [45,74]. In addition to these effects, our simulation results strongly indicate that the physisorption also depends on the endohedral metal atoms of SWNT. As a specific example, Figure 3a illustrates a snapshot of the physisorption process of the H<sub>2</sub> molecules on Ni<sub>5</sub>@SWNT (i.e., with a volume fraction of 22%). Here,  $d_{cut}$  is the cutoff interaction distance from the surface of SWNT used to estimate the region for stored H<sub>2</sub> molecules (see next paragraph). The figure indicates that the partial charges of Ni and H atoms near SWNT are positive, whereas those of C atoms are negative due to confinement [50,51,57,70] and the endohedral metal effect. Overall, our results show that the sum of the partial charges of SWNT carbon atoms are -2.56e, -3.72e, -5.63e, and -8.60e, nickel atoms are 0.0, 0.85e, 2.35e, and 4.08e, and those of hydrogen atoms are 2.56e, 2.87e, 3.28e, and 4.52e for volume fractions of 0, 4, 22, and 56%, respectively. These changes in the partial charges significantly impact the nonbonded interactions between H<sub>2</sub> molecules and SWNT.

The nonbonded interaction energy of a single H<sub>2</sub> molecule with pristine or Ni containing SWNT (Ni<sub>n</sub>@SWNT,  $n \in 0, 1, 5$  and 13) is depicted in Figure 3b, which is calculated as  $E = E_{H_2+Ni_n@SWNT} - (E_{H_2} + E_{Ni_n@SWNT})$ , where  $E_{H_2+Ni_n@SWNT}$ ,  $E_{H_2}$ , and  $E_{Ni_n@SWNT}$  are the potential energies of the



whole system, H<sub>2</sub> molecule and Ni<sub>n</sub>@SWNT, respectively [54,69]. The lowest interaction energy (i.e., most negative value) between the Ni<sub>n</sub>@SWNT and H<sub>2</sub> molecule is found to be -9.87, -10.01, -10.72 and -12.02 kJ·mol<sup>-1</sup> at approximately 2.24, 2.44, 2.34, 2.34 Å from the SWNT surface, for volume fractions of 0, 4, 22, and 56%, respectively. Overall, the area of the energy curve increases by increasing the number of endohedral atoms (see Fig. 3b).



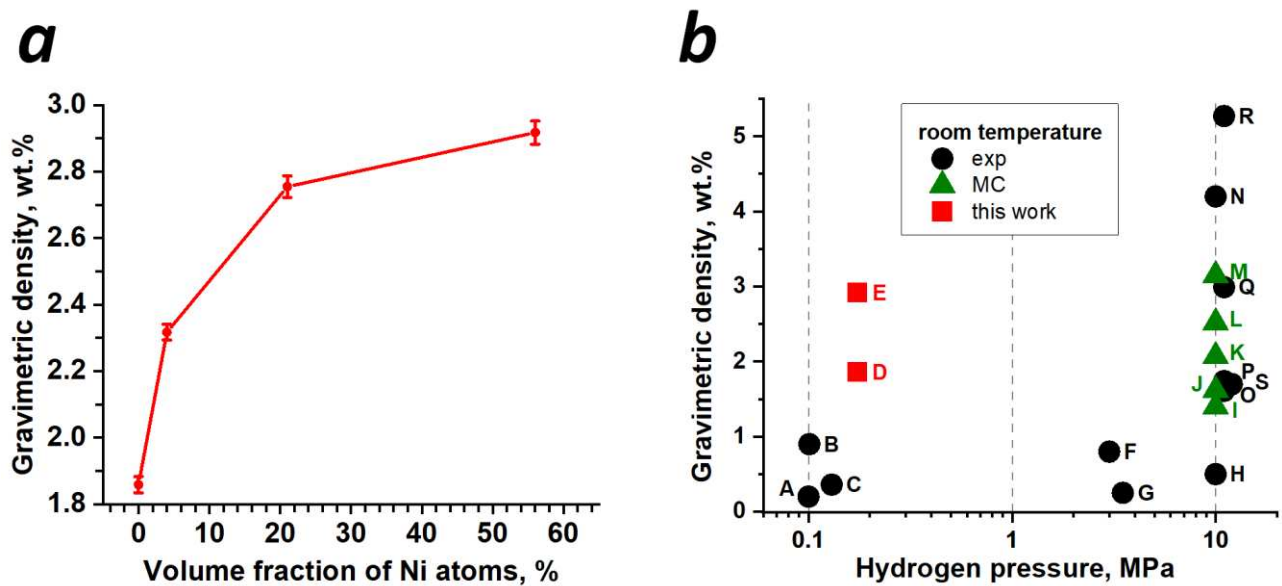
**Figure 3.** (a) The cross-section of Ni<sub>5</sub>@SWNT (i.e., the volume fraction of 22%) with surrounding H<sub>2</sub> molecules. The system atoms exhibit partial charges ranging from -0.7e to +0.7e, depicted by a color spectrum from red to blue, indicating the transition from electron-rich to electron-poor regions. The cutoff interaction distance ( $d_{cut}$ ) from the surface of Ni<sub>5</sub>@SWNT is 3.1 Å. (b) The distribution of the interaction energy between a single H<sub>2</sub> molecule and Ni<sub>n</sub>@SWNT (solid curves) as well as the concentration of H<sub>2</sub> molecules (dashed curves), as a function of  $d_{cut}$ . Each interaction energy curve is an average of 6 energy profiles obtained from trajectories equally distributed perpendicular to the nanotube's length (z-axis).

To determine the cutoff interaction distance from the surface of the SWNT ( $d_{cut}$ ) for physisorbed H<sub>2</sub> molecules, we use the energy point where the average kinetic energy of the H<sub>2</sub> molecule and its interaction energy with SWNT equals. The average kinetic energy of an H<sub>2</sub> molecule ( $\frac{5}{2}k_B T$ , where  $k_B$  is the Boltzmann constant and  $T$  is the room temperature) is found to be approximately 6.23 kJ·mol<sup>-1</sup> (see dashed line in Fig. 3b). This value is very close to the values reported by experiment (~6 kJ·mol<sup>-1</sup> [75]) and quantum-mechanical calculation results (6.56 kJ·mol<sup>-1</sup> [46]) for H<sub>2</sub> adsorption energy on

SWNT. The change in  $n$  of the  $Ni_n@SWNT$  system leads to alterations in the shape of the interaction energy profile (as mentioned above), consequently varying the cutoff interaction distance. In particular, as can be seen in Fig. 3b (dotted lines),  $d_{cut}$  is found to be approximately 2.88, 3.05, 3.10 and 3.25 Å for  $n = 0, 1, 5$  and 13 (or volume fractions of 0, 4, 22 and 56%), respectively. The obtained cutoff distance for the case of pristine SWNT (2.88 Å) is found to be within the experimental and theoretical adsorption distances for  $H_2$  molecules on SWNTs (i.e., 2.7-3.1 Å) [46,75].

For all volume fractions, the distribution of  $H_2$  concentration (represented by the dashed curves in Fig. 3b) reveals that while the distribution extends up to 7 Å, all peaks are located within 3.25 Å from the surface of the SWNT, corresponding to the largest  $d_{cut}$ . Specifically, these peaks are found at 0.12, 0.16, 0.18, and 0.21 Å<sup>-3</sup> for volume fractions of 0, 4, 22, and 56%, respectively. The  $H_2$  concentrations, obtained within the specific cutoff distances of each case, contribute to calculating the gravimetric density of physisorbed  $H_2$  molecules.

Figure 4a illustrates how the gravimetric density of physisorbed  $H_2$  molecules varies based on the volume fraction of endohedral Ni atoms within the SWNT. The gravimetric density is determined as  $m_H N_H \times (m_H N_H + m_C N_C + m_{Ni} N_{Ni})^{-1} \times 100\%$ , where  $m$  and  $N$  are the mass and number of H, C or Ni atoms [76].



**Figure 4.** (a) The average gravimetric density of physisorbed  $H_2$  molecules as a function of the volume fraction of endohedral Ni atoms. (b) Comparative analysis of gravimetric densities for hydrogen adsorption on SWNT obtained from literature data as a function of hydrogen pressure at approximately room temperature.

As shown in Figure 4a, the gravimetric density of the physisorbed H<sub>2</sub> molecules on pristine SWNT is 1.86 wt.%. This value corresponds to a degree of hydrogen coverage (N<sub>H</sub>/N<sub>C</sub>) equal to 22.72%, which is in good agreement with experimental (21-25% [26]) and simulation (22% [69]) data for pristine SWNTs at room temperature. In the case of SWNTs with endohedral Ni atoms at volume fractions of 4, 22, and 56%, the gravimetric density (or degree of hydrogen coverage) increases to 2.32 wt.% (29.09%), 2.75 wt.% (37.73%) and 2.92 wt.% (46.36%), respectively, i.e., by factors of 1.25 (1.28), 1.48 (1.66) and 1.57 (2.04) higher than that of pristine SWNT. The obtained results strongly indicate that an increase in the number of endohedral Ni atoms leads to an increase in the degree of surface coverage of SWNT with physisorbed H<sub>2</sub> molecules.

Please note that experimental studies typically focus on the average gravimetric density of SWNT forests, whereas our simulation work considers the gravimetric density of individual SWNTs, without accounting for environmental effects. To make a qualitative comparison, we review relevant literature data (detailed in Table S1) regarding gravimetric densities obtained in our simulations. Specifically, we select the values for pristine SWNT (1.86 wt.%) and SWNT with the highest concentration of endohedral Ni atoms (2.92 wt.%), denoted by D and E in Figure 4b, respectively. According to experimental and theoretical/computational reports [26,27,34,39,40,43-47], gravimetric densities of hydrogen on SWNTs are observed in the range of 0.2-5.27 wt.% at hydrogen pressures of 0.1-12 MPa and about room temperature (see Fig. 4b and Table S1). As is clear from the figure, most of the obtained higher values (see H-R in Fig. 4b) [26,44-47], including those above 5 wt.%, correspond to higher pressures (approximately 10 MPa), while at lower (including ambient) pressures, gravimetric densities are below 1 wt.% (see A-G in Fig. 4b) [26,27,34,40,43], except for the results of our study (see D and E in Fig. 4b). Although the gravimetric densities obtained from our simulations are similar to those reported by various experiments and Monte Carlo (MC) simulations (cf. D with J [46], O [47], P [47], and S [39] as well as E with M [46] and Q [77] in Fig. 4b and Table S1), the results convincingly show how to increase the hydrogen storage capacity of SWNTs under ambient conditions.

## Conclusions

In this study, we investigated the effect of endohedral Ni atoms on hydrogen physisorption on the SWNT surface by means of reactive MD simulations. The results show that Ni atoms weakly interact with the interior of SWNT due to the confinement effect. Consequently, this effect, along with the addition of Ni, collectively contributes to an increase in the gravimetric density of physisorbed hydrogen on SWNT upon increasing the volume fraction of endohedral Ni atoms. In particular, for SWNTs with endohedral Ni atoms at volume fractions of 0, 4, 22, and 56%, the gravimetric density

of physisorbed H<sub>2</sub> molecules was found to be 1.86, 2.32, 2.75, and 2.92 wt.%, respectively. Although these values are qualitatively close to the experimental and theoretical data, the results were obtained for nearly ambient pressure, which is approximately two orders of magnitude lower than the hydrogen pressures used for conventional hydrogen storage. In general, this study contributes to the atomic-level understanding of the role of endohedral transition metal nanocatalysts in enhancing the hydrogen storage capacity of carbon nanotubes under ambient conditions.

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