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# Atomistic Modelling of Low Dimensional Materials for Energy Harvesting and Gas Sensing Applications

S. RABAB NAQVI





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#### Abstract

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Energy crisis and pollution are the two biggest issues of the present times which are extremely important to address on priority. Scientists/Researchers are trying to explore and create alternate means of energy production which are sustainable and free from greenhouse emissions. Use of the hydrogen (H<sub>2</sub>) as an energy carrier can promise energy sustainability, economic viability, and environmental friendliness. H<sub>2</sub> is abundant in nature and delivers the highest energy density compared to all types of fossil fuels. However, the gaseous nature of the H<sub>2</sub> makes its storage difficult for practical applications. Previously employed H<sub>2</sub> storage strategies (liquefaction and pressurized storage) suffer from economic and safety concerns. H<sub>2</sub> storage in solid-state materials via non-dissociative adsorption is the most suitable technique. However, adsorption energies of the H<sub>2</sub> with the storage medium are typically very weak therefore operations under ambient working conditions are not possible. We used density functional theory to design the H<sub>2</sub> storage media, which are capable to adsorb H<sub>2</sub> in a non-dissociative manner with high gravimetric capacity and adequate adsorption energies for storage under the ambient conditions. Our findings point to the fact that the H<sub>2</sub> adsorption on the functionalized nanostructures is the most efficient approach for the materials based storage. Furthermore, for environmental safety and monitoring perspective, we investigated and proposed novel twodimensional nanomaterials that are capable to sense and capture hazardous gases from the environment. In short, this thesis work is an attempt towards designing efficient materials for H<sub>2</sub> based energy harvesting and gas sensing applications.

Keywords: Density functional theory, Low dimensional materials, Energy harvesting, Hydrogen storage, Gas Sensing

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# List of Papers

This thesis is based on the following papers, which are referred to in the text by their Roman numerals.

- I. Manipulating energy storage characteristics of ultrathin boron carbide monolayer under varied scandium doping
   S. R. Naqvi, T. Hussain, P. Panigrahi, W. Luo and R. Ahuja. RSC.
  - S. R. Naqvi, T. Hussain, P. Panigrahi, W. Luo and R. Ahuja. RSC. Adv. 7, 8598, (2017)
- II. Hexagonal boron nitride (h-BN) sheets decorated with OLi, ONa, and Li<sub>2</sub>F molecules for enhanced energy storage
  S. R. Naqvi, G. S. Rao, W. Luo, R. Ahuja and T. Hussain. Chem-PhysChem 18, 513, (2017)
- III. Metallized siligraphene nanosheets (SiC<sub>7</sub>) as high capacity hydrogen storage materials
   S. R. Naqvi, T. Hussain, W. Luo and R. Ahuja. Nano Research 11, 3802, (2018)
- IV. Exploring doping characteristics of various adatoms on single-layer stanene
  S. R. Naqvi, T. Hussain, W. Luo, and R. Ahuja. J. Phys. Chem. C 121, 7667, (2017)
- V. Light metal decorated graphdiyne nanosheets for reversible hydrogen storage
  P. Panigrahi, A. K. Dhinakaran, <u>S. R. Naqvi</u>, S. R. Gollu, R. Ahuja, and T. Hussain, Nanotechnology 29, 355401, (2018)
- VI. Enriching the hydrogen storage capacity of carbon nanotube doped with polylithiated molecules
  P. Panigrahi, S. R. Naqvi, M. Hankel, R. Ahuja, and T. Hussain, Appl. Surf. Sci. 444, 467, (2018)

- VII. Exploring two-dimensional M<sub>2</sub>NS<sub>2</sub> (M= Ti, V) MXenes based sensors for air pollutants
  - <u>S. R. Naqvi</u>, V. Shukla, N. K. Jena, W. Luo, and R. Ahuja, Appl. Mater. Today, **19**, 100574, (2020)
- VIII. Superior sensitivity of metal functionalized boron carbide (BC<sub>3</sub>) monolayer towards carbonaceous pollutants
  - <u>S. R. Naqvi</u>, T. Hussain, S. R. Gollu, W. Luo, and R. Ahuja, Appl. Surf. Sci. **512**, 145637 (2020)
  - IX. Computational insights into the hydrogen storage characteristics of Li and Na decorated 2D Boron Phosphide

N. Khossossi, Y. Benhouria, <u>S. R. Naqvi</u>, P. K. Panda, Y. K. Mishra, I. Essaoudi, A. Ainane, and R. Ahuja *Manuscript* 

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### Comments on my own contribution

All the work in the paper I to IX was performed in close collaboration with the coauthors. The papers where I appear as the First author, I was responsible for performing the computations using the VASP code, analyzing the data, preparing the figures and writing the paper. In paper V and VI, I partly analyzed the data, prepared the figures and contributed to writing the papers. In paper IX, I designed the project, helped with VASP based computations, and contributed to writing the paper.

# List of papers not included in the thesis

The following papers were produced during the time frame of this thesis, but are not included in the thesis.

- I. Modelling high-performing batteries with MXenes: The case of S-functionalized two-dimensional Nitride MXene Electrode V. Shukla, N. K. Jena, S. R. Naqvi, W. Luo, and R. Ahuja. Nano Energy 58, 877, (2019)
- II. Energy loss of slow Ne ions in Pt and Ag from TOF-MEIS and Monte-Carlo simulations
  S. R. Naqvi, G. Possnert, and D. Primetzhofer, Nucl. Instrum. Methods Phys. Res., Sect. B, 371, 76, (2016)
- III. Metallized nitrogenated holey graphene nanosheets (C<sub>2</sub>N): A promising material for high capacity clean energy storage S. R. Naqvi, T. Hussain, A. Karton, W. Luo, and R. Ahuja Manuscript

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Part I: Introduction and Theoretical Background

## 1 Introduction

Since the beginning of life on the planet, mankind has been using science and technology to find the ease, luxuries, and comforts for living. For instance, advanced means of transportation are utilized on the ground, inside the water, and in the air. Heating and cooling systems are used for temperature adjustment inside the residential areas, and the offices. Advanced revolutionary materials are designed and used for information handling, entertainment, and global networking. In short, the endeavoring efforts and intelligence of human beings led this world to the point where life of an average man is much more comfortable than it could ever be imagined. Besides all the progress and accomplishments, however, our planet is much more vulnerable to natural calamities and disasters due to irreversible and devastating climate changes. According to a recent report of the World Bank [1], if the climate changes continue at the same pace then the parts of various coastal megacities would be under water near the year 2030. Additionally, an ever- growing trend in forest fires is expected due to the increase in the earth's temperature [2]. The major stimulus behind the unprecedented climate catastrophe is the *Energy crisis*.

Energy is a prerequisite for living and sustainable energy harvesting is the biggest technological challenge of the current times. Additionally, it is essential for uninterrupted scientific and technological development. Thanks to their high abundance in the earth's crust and the high energy-efficiency, fossil fuels were employed to meet the never-ending demands of energy for a very long time. However, relentless consumption of fossil fuels gave birth to potential environmental concerns. For instance, a drastic amount of CO<sub>2</sub> is emitted to the atmosphere which is the major culprit behind the global climate crisis. On the other hand, the available fossil reserves are gradually depleting and demands of energy are growing with time, which is responsible for a rapid rise in fuel prices. As reported, the demands of energy between the year 2009 and 2035 are expected to grow from 12 to 18 billion tons of oil equivalent [1– 3]. Due to the higher demands of energy consumption and the continuous depletion of the fossil reserves, coal is expected to be the only available fossil reserve in the earth's crust after the year 2042 [4]. It is the need of the hour to find alternative means of energy production which are reversible, sustainable, cost-effective and environment friendly. In this regard, the energy from photovoltaics, solar, windmill, nuclear, biomass, and geothermal sources are being produced and utilized for industrial and domestic applications [5–7].

Meanwhile, Li-ion batteries earned huge scientific interest due to the high energy density, storage efficiency, and versatility of applications ranging from small scale electronic devices to vehicles and large-scale energy systems [8].

However, by virtue of its abundance in nature and high energy content, hydrogen (H<sub>2</sub>) is so far an ideal carrier of sustainable energy [9, 10]. H<sub>2</sub> has unique characteristics surpassing all the other energy carriers, for instance, its high energy density, renewability, and a clean reaction in the fuel cell where water is emitted as the only by-product [11]. The comparison of the H<sub>2</sub> output energy content with the gasoline yields that 1kg of H<sub>2</sub> produces 143 MJ of energy which is equivalent to the heat content produced by combustion of 3 Kg of gasoline [12]. Similarly, the efficiency of the H<sub>2</sub> fuel cells is reported to be superior to Li-ion batteries in the transport sector [13–15]. Particularly for the vehicles with a range of more than 100 miles, H<sub>2</sub> fuel cells are reported to offer better energy efficiency, smaller refueling time and a higher environmental friendliness [16]. Besides automobiles, fuel cells are used in aircrafts, ships, forklifts, trains, as well as for stationary applications [17]. However, the fuel cell technology is under development and efficient means of H<sub>2</sub> production and storage for fuel cell applications are scarce as yet.

Although  $H_2$  is the major constituent of the universe, still very small amounts of gaseous  $H_2$  ( $5\times10^{-5}$  mole fraction) exist in the earth's atmosphere [18]. This is partly due to the highly reactive nature of  $H_2$  which allows it to form bonds with other elements. For example,  $H_2$  is found in the form of water or it reacts with carbon, nitrogen, and oxygen to form the fossil fuels or biomass. Here it is important to state that  $H_2$  itself is not a primary fuel, however, it becomes an energy carrier when energy is used to split the  $H_2$  from other elements [19]. For  $H_2$  production, steam reforming of natural gas and the coal gasification were previously employed, however, emission of CO and CO<sub>2</sub> as by-products makes these processes environmentally unsafe [19]. Recently, electrolysis of water using the energy obtained from solar or wind resources, and the thermochemical processes are considered as efficient, environmentally benign and reliable technologies for  $H_2$  production [19–22].

An ideal  $H_2$  fuel cell is expected to replace the fossil fuel dependence of the whole world while eliminating the environmental issues; the vision is called the *Hydrogen Economy*. The hydrogen economy works on a sustainable cycle, which starts from the production of  $H_2$  from the electrolysis of water with the help of renewable energy, such as, solar or wind.  $H_2$  is stored and later used in a fuel cell where  $H_2$  reacts with  $O_2$  and releases water as a byproduct. The produced energy is used for transportation, industrial or domestic usages and finally the released water again becomes available for  $H_2$  production. In this sustainable cycle,  $H_2O$  acts as a carrier of  $H_2$  and  $H_2$  acts as a carrier of energy. The concept of  $H_2$  -  $H_2O$  sustainable cycle is illustrated in Figure 1.1.

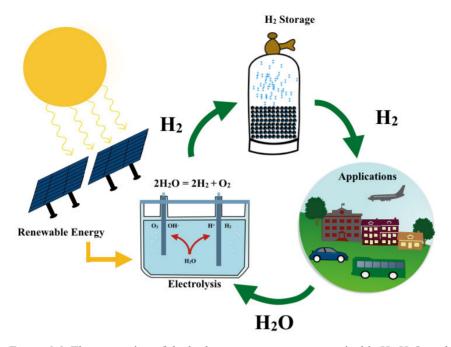


Figure 1.1. The perception of the hydrogen economy as a sustainable H<sub>2</sub>-H<sub>2</sub>O cycle.

The major obstacle in the  $H_2$  economy is to store  $H_2$  under ambient conditions for onboard applications. This is the first main topic of this thesis and details are contained in Chapter 3. Here, a brief introduction of the  $H_2$  storage problem, conventional strategies and new developments along with their pros and cons are discussed.

The challenge of  $H_2$  storage arises from the fact that  $H_2$  has a very low volumetric density  $\sim 0.09~\text{Kg/m}^3$  at ambient conditions (at 25 °C or 298 K, and 100 kPa or 1 Bar). For instance, 1 Kg of  $H_2$  occupies a volume roughly equivalent to  $12~\text{m}^3$ . Thus, the energy produced from  $H_2$  contained in 1  $\text{m}^3$  of the volume is only 0.1 MJ, whereas, the equivalent volume of gasoline produces 34.2 MJ [12]. To utilize the potential of  $H_2$  as a fuel, either it must be mechanically transformed to a state which is easier to handle for fuel cell applications, e.g., liquefied and compressed states, or it should be trapped inside the materials making chemical bonds or interacting via van der Waals forces. For practical implications,  $H_2$  storage technique should be able to meet the following criteria: (1) high storage capacity, (2) low system-weight, (3) safety of operation, (4) cost-effectiveness, (5) environmental friendliness, (6) operability under ambient conditions and (7) reversibility.

The strategy of mechanical storage is conventionally employed to increase the volumetric capacity, however, transforming  $H_2$  to a liquid or a compressed state is the unviable and a tedious approach which poses several practical con-

cerns, such as, volume, weight, and safety issues. The compression, for example, needs very high pressure up to ~700 bar to compress the gas with a gravimetric capacity of 5.2 wt% [23]. Another important issue is the fabrication of the storage tank because the compression tank is required to be lightweight, low cost, and durable to withstand the possible embrittlement during the operation. Several materials are designed and utilized for this purpose, however, the durability of the material, high cost, and the risk of explosion in case of a car crash are potential concerns which call for the improved design and manufacturing technologies [24–26]. On the other hand, the liquefaction, also called cryogenic cooling, requires energy for cooling down to ~20 K, moreover, a large amount of energy is required for maintaining the liquid phase. This is a very expensive process that requires almost 35% of the fuel energy content for liquefaction. Additionally, there is a loss of H<sub>2</sub> by evaporation and boil-off processes which are typically caused due to the heat adsorption during operation on vehicles, during refueling, and delivery procedures [27]. Another mechanical H<sub>2</sub> storage technique which was practically employed in Toyota Prius cars, named as cryocompression, exhibited better performance than other mechanical H<sub>2</sub> storage methods [28]. This technique uses the combination of compression and cryogenic H<sub>2</sub> storage techniques and fulfills the standard of the Department of Energy (DOE) for gravimetric capacity, however, the cost of a prototype system for H<sub>2</sub> storage and the cost of the fuel is much higher than the DOE criteria [29].

The second approach for H<sub>2</sub> storage, which is based on trapping H<sub>2</sub> inside the solid-state materials, via chemical bonding or physical adsorption mechanisms, seems the promising and viable choice to fulfill the H<sub>2</sub> storage criteria. During the chemical adsorption process, H<sub>2</sub> bond dissociates and each H atom forms chemical bonds with the host material typically with the adsorption strength of ~2-3 eV [26, 30, 31]. A large number of H atoms can be stored in the form of metal hydrides, however, the total weight of the system turns out to be very high which limits the gravimetric and volumetric capacities. Some prominent metal hydride systems are LiAlH<sub>4</sub>, LiNH<sub>2</sub>, Li<sub>2</sub>NH, LiBH<sub>4</sub>, NaAlH<sub>4</sub>, KAlH<sub>4</sub>, MgH<sub>2</sub>, and LaNi<sub>5</sub>H<sub>6</sub> [32-37]. Conversely, non-metal hydrides, such as boron and nitrogen hydrides, captured wide interest due to their lighter weight and higher gravimetric capacity. However, slower kinetics during the H<sub>2</sub> release is another practical hindrance which limits the applications of most of the chemical hydride based systems [38–40]. Additionally, the onboard refueling for chemical hydride materials is not possible, which limits the applicability to only those situations where onboard refueling is not preferred, such as, jets, rockets, and non-rechargeable batteries.

The physisorption or non-dissociative  $H_2$  adsorption via van der Waals interaction, on the other hand, offers advantages of reversibility, and faster kinetics. Due to the high surface-to-volume ratio, low dimensional nanostructures are capable to adsorb a large quantity of  $H_2$ , fulfilling the criterion of gravimetric capacity described by the DOE. The light weight of the material

further ensures the convenience of operation for portable applications. Examples of  $H_2$  adsorption materials include carbonaceous structures, such as graphene, carbon nanotubes, and non-carbon materials including metal-organic frameworks (MOFs) and clathrates [27, 41–45]. The difficulty with non-dissociative materials-based  $H_2$  storage arises due to the weaker ( $\sim 0.1$  eV) adsorption energies of the  $H_2$  with the host material which are not sufficient for  $H_2$  adsorption at ambient conditions [30, 31]. Based on the literature,  $H_2$  storage via adsorption could be a prospective storage technique for the  $H_2$  economy, however, it is required to tune the adsorption energies employing external species or surface modifications in the host material [41–45]. Chapter 3 of the thesis comprises the discussion and important outcomes of our work for  $H_2$  storage on low dimensional structures.

Designing efficient materials for H<sub>2</sub> storage paves the way for clean energy and ensures the sustainability of the environment. However, monitoring and capturing of the suspended pollutants in the air is another important issue. A large amount of hazardous gases that can severely affect human health are emitted in the atmosphere due to industrial, natural, and biogenic processes. Moreover, the greenhouse effect is one of the several reasons which calls for efficient gas sensing and capturing of the gases. Among others, carbon-containing gases, such as carbon monoxide (CO), carbon dioxide (CO<sub>2</sub>) and methane (CH<sub>4</sub>) are directly or indirectly causing the greenhouse effect. For instance, CO is extremely hazardous as it can severely damage the human heart and the brain, causing sudden death. Similarly, ammonia (NH<sub>3</sub>), nitric oxide (NO), nitrogen dioxide (NO<sub>2</sub>), hydrogen sulfide (H<sub>2</sub>S) and sulfur dioxide (SO<sub>2</sub>) have adverse effects on the climate and the human health. Therefore, it is inevitable to monitor the leakage of these gases in the atmosphere to avoid serious health hazards. Semiconducting metal oxides and conducting polymers were previously employed for this purpose. Metal oxide-based sensors offer good sensitivity and low cost, but the operability is limited to higher operating temperatures and large power consumption, moreover, the selectivity of gases in these sensors is compromised [46, 47]. Contrarily, conducting polymers offer room temperature applicability and easy processing but suffer from humidity and degradation which limit their efficiency [48, 49]. Carbon nanotubes (CNTs) exhibit superior sensing performance with high selectivity of gases, however, long recovery times and processing difficulties hinder the performance of CNTs as a gas sensor [48]. Therefore, it is important to design materials that can efficiently sense pollutant molecules with high selectivity and less signal-to-noise ratio. In Chapter 4 of the thesis, the role of two-dimensional structures for efficient gas sensing is discussed along with important outcomes of our research. Meanwhile, understanding the structure and electronic properties of 2D structures can pave ways for their nanoscale device applications. In this regard, the effects of adatoms on structural and electronic properties of stanene monolayer are investigated and the results are briefly summarized in Chapter 5.

### 1.1 Outline of the Thesis

We used Density Functional Theory (DFT) to design the nanomaterials for H<sub>2</sub> storage and gas sensing applications. In this regard, the H<sub>2</sub> storage on functionalized boron carbide (BC<sub>3</sub>), boron nitride (BN), siligraphene (SiC<sub>7</sub>), carbon nanotubes (CNTs) and graphdivne (GDY) nanostructures were studied. Similarly, metal-functionalized BC<sub>3</sub> sheets and S-functionalized M<sub>2</sub>N MXene sheets were investigated for sensing and capturing of toxic gases. Also, the adsorption of different adatoms on two-dimensional stanene sheets was investigated. The Chapter 1, Introduction, is a brief description of the essence and motivation of this work, a summary of the previously made development in the field, major challenges and, the helpful strategies to tackle the challenges are introduced. Most importantly, it is described how the present work is going to contribute towards the field of energy harvesting and gas sensing. The Chapter 2, *Theoretical Background*, is dedicated to density functional theory. In the first part of this chapter, the many-body problem in physics is introduced and the essence of a DFT based computational approach is described. The development of DFT along with the associated formalism for solving the multi-electron systems are further described in the preceding sections of the chapter. In the second part, the computational methods for efficiently employing the DFT are explained in detail. In Chapter 3, entitled Solid-State Materials for Hydrogen Storage, different strategies for H<sub>2</sub> storage in solid-state materials are explained. Moreover, some of the important findings of this thesis work on the subject of H<sub>2</sub> storage are presented in this chapter. The Chapter 4 of the thesis, 2D Structures for Gas Sensing Applications, covers the applications of 2D materials for sensing of air pollutants. In this perspective, types of pollutants, the mechanism of gas sensing, and sensing performance of investigated 2D structures are discussed. The Chapter 5, Tuning the Structure and Electronic Properties of 2D Materials, constitutes the effects of adatom adsorption on two-dimensional sheets. Particularly, the important outcomes of the adatom adsorption on stanene sheets are discussed. The Summary and outlook of the thesis are presented in Chapter 6. The summary of the thesis in Swedish, Svensk Sammanfattning, is provided in Chapter 7. Further details of the work, complete methodology, and the detailed discussions are present in the original papers which are attached at the end of this thesis.

# 2 Theoretical Background

Density functional theory (DFT) is the powerful computational approach to efficiently solve the puzzles of chemistry, physics, material sciences, and multiple disciplines of engineering. With widespread development spanned over more than 50 years, DFT is one of the most cost-effective, reliable and valuable tools for predicting the geometry, electronic structure, and a broad spectrum of compelling material properties. DFT is inevitable for the progressive engineering of materials, as the in-depth knowledge and understanding of the complicated scientific problems can't be achieved solely based on the experiments. Since all the computations in this thesis are performed using DFT, therefore, this section of the thesis is dedicated to describing the background and theoretical formalism of DFT.

# 2.1 The Many-Body Problem

The basic properties of materials depend on their fundamental constituents, i.e. the electrons and the nuclei. If one can thoroughly predict the nature of interactions between electrons in the matter then a widespread knowledge of the material properties can be extracted, such as electronic, electrical, optical, and magnetic behaviors. To understand the underlying physics of the materials, we need to solve the systems with plenty of atoms dressed up with many electrons, typically known as *Many-body problem* [50]. Quantum physics represents the many-body problem in the form of a many-body equation, named as Schrödinger equation. Time-independent non-relativistic Schrödinger equation can be written as under

$$H\Psi(\mathbf{r}_{1}, \mathbf{r}_{2}, ..., \mathbf{r}_{n}, \mathbf{R}_{1}, \mathbf{R}_{2}, ..., \mathbf{R}_{N}) = E\Psi(\mathbf{r}_{1}, \mathbf{r}_{2}, ..., \mathbf{r}_{n}, \mathbf{R}_{1}, \mathbf{R}_{2}, ..., \mathbf{R}_{N})$$
(2.1)

Here,  $\Psi$  ( $r_1$ ,  $r_2$ , ...,  $r_n$ ,  $R_1$ ,  $R_2$ , ...,  $R_N$ ) represents a wavefunction for the system of n electron and N nuclei whose positions are described by  $r_i$  and  $R_I$ , respectively. All the information that can be attained about the system at some particular state is contained in  $\Psi$ . Here, the Hamiltonian operator H acts on  $\Psi$  and yields the energy eigenvalue E. The complete form of Hamiltonian can be expressed as,

$$H = -\frac{\hbar^2}{2m_e} \sum_{i} \nabla_{i}^2 - \frac{\hbar^2}{2} \sum_{I} \frac{\nabla_{I}^2}{M_I} + \frac{1}{2} \sum_{i \neq j} \frac{e^2}{|\mathbf{r}_i - \mathbf{r}_j|} + \frac{1}{2} \sum_{I \neq J} \frac{Z_I Z_J e^2}{|\mathbf{R}_I - \mathbf{R}_J|} - \sum_{i,I} \frac{Z_I e^2}{|\mathbf{r}_i - \mathbf{R}_I|}$$

$$(2.2)$$

Here, in atomic units  $r_i$ ,  $m_e$  and e denote the electronic spatial coordinates, mass, and charge of i<sup>th</sup> electron, respectively. Similarly  $\mathbf{R}_{I}$ ,  $\mathbf{M}_{I}$  and, Z are the respective nuclear components for the I<sup>th</sup> nucleus and the term  $\hbar = h/2\pi$  represents the reduced Plank's constant. The kinetic energy of the electrons and the nuclei is computed by using the first two terms in eq. (2.2), respectively. The remaining three terms compute the potential energy due to the Coulomb forces between the electron-electron, the nucleus-nucleus, and the electronnucleus pairs, respectively. Eq. (2.2) yields an exact solution for the small systems, for example, a particle in a box and atoms with a single electron (H, He<sup>+</sup>, Li<sup>2+</sup>). For a multiple-electron system, the *Born-Oppenheimer approxima*tion (BOA) is employed to simplify the Hamiltonian [51]. BOA splits the wavefunction into electronic and nuclear components based on the assumption that there is a huge mass difference between an electron and the nucleus. As the electrons are much lighter compared to the nuclei (1836  $\times$  m<sub>e</sub>  $\cong$  M<sub>I</sub>), therefore the speed of electrons is much higher compared to the nuclei ( $v_e >> v_I$ ). For this reason, the nuclei can be imagined as frozen particles in the sea of high-speed electrons. Thus one can consider that electrons are moving on a potential energy surface provided by the nuclei. Due to this approximation, the nuclear kinetic energy term enters in the Eq. (2.2) only as the potential (V<sub>ext</sub>) externally supplied to the electrons. The wavefunction can thus be rewritten as follows

$$\Psi(\mathbf{r}_{1}, \mathbf{r}_{2}, \dots, \mathbf{r}_{n}, \mathbf{R}_{1}, \mathbf{R}_{2}, \dots, \mathbf{R}_{N}) = \Psi_{e}(\mathbf{r}_{1}, \mathbf{r}_{2}, \dots, \mathbf{r}_{n})\Psi_{N}(\mathbf{R}_{1}, \mathbf{R}_{2}, \dots, \mathbf{R}_{N})$$
(2.3)

The Hamiltonian transforms according to BOA [52], as under

$$H = -\frac{\hbar^2}{2m_e} \sum_{i} \nabla_i^2 + \frac{1}{2} \sum_{i \neq j} \frac{e^2}{|\mathbf{r}_i - \mathbf{r}_j|} - \sum_{i,l} \frac{Z_l e^2}{|\mathbf{r}_i - \mathbf{R}_l|}$$
(2.4)

Thus a purely electronic Hamiltonian is written, where the kinetic energy of the nuclei vanishes and the nuclear contribution acts as a constant ( $V_{ext}$ ). The use of BOA reduces the complexity of the problem, however, the exact wavefunction for a many-body system is still not easy to find due to the electronic correlations. The motion of electron 1 in a N-electron system and its interaction with the frozen nuclei are affected by the Coulomb forces provided by N-1 electrons. Thus, the electronic correlation further adds to the complexity of the problem, therefore, eq. (2.4) lacks to provide a complete analytical solution for the multiple-electron systems. To simplify the situation, the concept of independent-electrons was introduced in the form of *Hartree and Hartree*-

Fock formalism which is based on the assumption that the electrons are non-interacting (i.e.,  $V_{ee} = 0$ ). Under these theories, the Hamiltonian is separable and the problem of correlated N electrons can be transformed into a N single-electron problem. Thus, the Hamiltonian for a system of N non-interacting particles is defined as under,

$$H = \sum_{i=1}^{N} h(i) \tag{2.5}$$

Here h(i) is the operator that gives the kinetic energy and the potential energy of the electron i. Eigenfunction of the H operator is a wavefunction which is a product of spin-orbital wavefunctions  $\chi(x)$ , as under,

$$\psi^{HP}(\mathbf{x}_{1}, \mathbf{x}_{2}, ..., \mathbf{x}_{N}) = \chi_{i}(\mathbf{x}_{1}) \chi_{i}(\mathbf{x}_{2}) ... \chi_{k}(\mathbf{x}_{N})$$
(2.6)

Here,  $\psi^{HP}$  denotes the *Hartree Product*. The Hamiltonian operator H acts on  $\psi^{HP}$  which yields  $H\psi^{HP} = E\psi^{HP}$ . The energy is defined as the sum of spin-orbital energies ( $E = \epsilon_i + \epsilon_j + \dots + \epsilon_k$ ). The Hartree product defined as Eq. (2.6) has a serious shortcoming that it does not obey Pauli's exclusion principle and electrons are distinguishable. For instance, the probability of finding electrons 1 to N in a volume element could be expressed by the following relationship,

$$|\psi^{HP}(\mathbf{x}_{1}, \mathbf{x}_{2}, ..., \mathbf{x}_{N})|^{2} d\mathbf{x}_{1} ... d\mathbf{x}_{N} = |\chi_{i}(\mathbf{x}_{1})|^{2} d\mathbf{x}_{1} |\chi_{j}(\mathbf{x}_{2})|^{2} d\mathbf{x}_{2} ... |\chi_{k}(\mathbf{x}_{N})|^{2} d\mathbf{x}_{N}$$
(2.7)

Here, the simultaneous probability of finding electron 1 in  $d\mathbf{x}_1$  and electron 2 in  $d\mathbf{x}_2$  is equal to the product of probabilities. According to this formalism, electron 1 is completely independent of other electrons. This is not true for the case of electrons with parallel spins. If we have a system of two electrons with parallel spins, then the probability of finding both electrons at position  $\mathbf{r}_1$  is zero i.e.,  $P(\mathbf{r}_1, \mathbf{r}_1) = 0$ . However, electrons with opposite spins are always uncorrelated and independent of each other. Hartree Product  $(\psi^{HP})$  for electrons 1 and 2 can be written as follows

$$\psi_{12}^{HP}(\mathbf{x}_1, \mathbf{x}_2) = \chi_i(\mathbf{x}_1) \, \chi_j(\mathbf{x}_2) \tag{2.8}$$

$$\psi_{21}^{HP}(\mathbf{x}_1, \mathbf{x}_2) = \chi_i(\mathbf{x}_2) \, \chi_i(\mathbf{x}_1) \tag{2.9}$$

A wavefunction which obeys anti-symmetry could be obtained as an appropriate linear combination of the above two Hartree Products.

$$\psi(\mathbf{x}_1, \mathbf{x}_2) = 2^{-1/2} \left( \chi_i(\mathbf{x}_1) \, \chi_i(\mathbf{x}_2) - \, \chi_i(\mathbf{x}_1) \, \chi_i(\mathbf{x}_2) \right) \tag{2.10}$$

This anti-symmetrized wavefunction was named as *Hartree-Fock (HF)* wavefunction. HF wavefunction could be generalized in the form of a determinant, called Slater determinant named after John Slater. For two electrons Slater determinant form of the HF wavefunction is written as below,

$$\psi(\mathbf{x}_1, \mathbf{x}_2) = 2^{-1/2} \begin{vmatrix} \chi_i(\mathbf{x}_1) & \chi_j(\mathbf{x}_1) \\ \chi_i(\mathbf{x}_2) & \chi_j(\mathbf{x}_2) \end{vmatrix}$$
(2.11)

It is easy to see that if two electrons are introduced in a similar orbital (i.e.,  $\mathcal{X}_i = \mathcal{X}_j$ ), then  $\Psi(\mathbf{x}_1, \mathbf{x}_2)$  goes to zero which is another way to justify *Pauli exclusion principle*. Electrons are indistinguishable and therefore belong to every orbital. For N electrons, the Slater determinant is written as under,

$$\psi\left(\boldsymbol{x}_{1},\boldsymbol{x}_{2},\ldots,\boldsymbol{x}_{N}\right)=(N!)^{-1/2}\begin{vmatrix} \chi_{i}(\boldsymbol{x}_{1}) & \cdots & \chi_{k}(\boldsymbol{x}_{1}) \\ \vdots & \ddots & \vdots \\ \chi_{i}(\boldsymbol{x}_{N}) & \cdots & \chi_{k}(\boldsymbol{x}_{N}) \end{vmatrix}$$
(2.12)

The Slater determinant is symbolically represented as  $|\psi_1, \psi_1, \dots \psi_1\rangle$  and provides the solution of the Schrödinger equation. HF theory is based on the approximation that each particle feels an average field due to the presence of surrounding charged particles, named as Mean-field approximation. HF solution gives the accurate ground state energy by using a single Slater determinant (N-electron) to approximate a ground state wavefunction of N electrons. Within single slater determinant, motion of electrons with parallel spins are correlated whereas electrons with antiparallel spins are uncorrelated. In order to obtain the ground state energy according to HF theory, the Slater determinant is minimized  $E_{HF} = min_{\psi_{SD \to N}} E[\psi_{SD}]$  with the help of variational theorem. This is a Self-Consistency Field (SCF) method which begins with a random guess of a set of atomic orbitals. Those sets of orbitals are used to find the energy and subsequently the new orbitals. The process continues until the convergence is achieved. The wavefunction for the N electrons is defined in terms of four variables, i.e. three position coordinates and one spin coordinate. The exponential scaling of the HF method with 4N leads to a great deal of computational challenges. However, HF formalism was a great breakthrough which simplified the many-body problem and laid down the foundations of the most advanced electronic structure methods and density functional theory (DFT) is one of them.

The problem of 4N variables could be simplified by replacing the wavefunction with the electron density which is a 3 variable function. Due to the complex nature of the electronic interactions, the exact solution of the Schrodinger equation is scarce as yet, however, the complexity of the problem is minimized with the help of density functional theory (DFT). This thesis is based on the computations performed by the Vienna Ab-initio Simulation Package (VASP) which is a DFT based code. In the subsequent sections, the development of the DFT formalism and the computational methods are explained in the detail.

# 2.2 Density Functional Theory (DFT) Formalism

As mentioned in the previous section, HF theory was based on a reasonable approach for computing the accurate ground state energy of the many-body system. However, the biggest challenge was to determine the complicated many-body wavefunction. If one could replace a wavefunction based approach with a much simpler electron density based formalism then the computational difficulties could be handled without sacrificing the quality of results. Hence, DFT formalism was born as a reliable and cost-effective solution to the many-body problem.

Before digging deep into the DFT theory, it is worthwhile to understand the importance of using the density of electrons  $\rho(\mathbf{r})$  instead of the wavefunction. The first reason is that  $\rho(\mathbf{r})$  is a mathematical parameter that is possible to measure. This observable entity makes it possible to get a mapping of the system which is relatively closer to reality. The integral of  $\rho(\mathbf{r})$  over the volume element gives the total number of electrons N contained in that specific volume as follows,

$$\int \rho(\mathbf{r}) \, d\mathbf{r} = N \tag{2.13}$$

The nuclear charges can be computed by the information of  $\rho(\mathbf{r})$  around the nuclei. As the nuclear attractive forces tend to keep the electrons together and the density  $\rho(r)$  is maximum close to the nuclei,  $\mathbf{R}_{\rm I}$ . The gradient of density undergoes discontinuity around this region and cusps are formed. Thomas and Fermi were the first to use the concept of  $\rho(r)$  as a variable to determine the total energy of the system [52, 53]. However, due to the absence of exchange and correlation parts in the Thomas-fermi theory, one could not apply this formalism to solve the many-body problem. The consideration of simplified non-interacting uniform electron gas for computing the kinetic energy of electrons was not realistic. Moreover, the electron-electron Coulomb repulsion and electron-nuclei attractive potentials were classically treated. This simplified approach for computing the kinetic energy of electrons was inefficient, since the exchange and correlation parts were completely missing. The accurate depiction of the many-body system was lacking even after the inclusion of exchange energy suggested by Dirac [54]. The present-day DFT is standing on the pillars of some fundamental theories which were first introduced by Hohenberg and Kohn [55].

### 2.2.1 Hohenberg-Kohn (HK) Theorems

Hohenberg and Kohn provided the solution of an interacting many-body system using  $\rho(\mathbf{r})$  in their sensational work which laid down the foundations of contemporary DFT. The theory was presented in the form of two landmark theorems<sup>1</sup>:

#### Theorem I:

For any system of interacting particles in an external potential  $V_{ext}(\mathbf{r})$ , the potential  $V_{ext}(\mathbf{r})$  can be is determined uniquely, except for a constant, by the ground state particle density  $\rho_0(\mathbf{r})$ .

#### Theorem II:

A universal functional for the energy  $E[\rho]$  in terms of density  $\rho(\mathbf{r})$  can be defined, valid for any external potential  $V_{ext}(\mathbf{r})$ . For any particular  $V_{ext}(\mathbf{r})$ , the exact ground state energy of the system is the global minimum value of this functional, and the density  $\rho(\mathbf{r})$  that minimizes the functional is the exact ground state density  $\rho_0(\mathbf{r})$ .

The first HK theorem suggests that the density of electrons at the ground state  $\rho_0(\mathbf{r})$  is sufficient to unveil the properties of a system of interacting particles, whereas,  $V_{ext}(\mathbf{r})$  is just included as a constant. More explicitly, the ground state density is sufficient to determine the exact form of the many-body Hamiltonian. Further, the functional of electron density can be utilized to determine all the observable entities of the system as

$$\langle \psi | A | \psi \rangle = A \left[ \rho(\mathbf{r}) \right] \tag{2.14}$$

The second theorem reveals how to determine the exact ground state density  $\rho_0(\mathbf{r})$ . The electron density at the ground state can be determined by finding the minimum value of the energy functional  $E[\rho]$ . The density corresponding to that minimum  $E_0[\rho]$  is the ground state density  $\rho_0(\mathbf{r})$ . Based on these theorems, the functional of total energy can be expressed in terms of electron density as

$$E_{HK}[\rho(\mathbf{r})] = F_{HK}[\rho(\mathbf{r})] + \int d\mathbf{r} V_{ext}(\mathbf{r}) \rho(\mathbf{r})$$
 (2.15)

<sup>&</sup>lt;sup>1</sup>The statements of the HK theorems are quoted from the book entitled "Electronic structure: Basic Theory and Practical Methods" by Richard. M. Martin [50].

Here,  $F_{HK}[\rho(r)]$  is the universal functional which contains the total internal energies of the system of interacting particles as below,

$$F_{HK}[\rho(\mathbf{r})] = T[\rho(\mathbf{r})] + J[\rho(\mathbf{r})] + E_{ncl}[\rho(\mathbf{r})]$$
(2.16)

Where the first two terms in Eq. (2.16) represent the kinetic energy of electrons and the potential energy due to classical Coulomb interaction, respectively. The third term accounts for the non-classical contributions to the total energy, i.e. self-interaction, correlation, and exchange effects. By accurately predicting the universal functional  $F_{HK}[\rho(r)]$ , one can successfully obtain the exact energy of the system at the ground state. Similarly, the ground state density can be obtained by minimizing the energy functional,  $E[\rho(r)]$ . Due to the non-classical contributions to the energy of the correlated system, only the second term in the above equation could be accurately computed. Thus, the ambiguity of computationally solving a complicated interacting system of particles remained unresolved as the exact form of the first and third terms in Eq. (2.16) is unknown.

#### 2.2.2 The Kohn-Sham Ansatz

In the outclass work of Hohenberg and Kohn, the solution of a many-body problem is provided in terms of a universal functional, however, the exact solution of the ground state density is not provided. The Kohn-Sham (KS) formalism shows a simplified approach for the realization of the exact form of the ground state density. It is based on the idea that a system of interacting particles can be replaced with a relatively simpler reference system of non-interacting particles having the exact same density of electrons such that the applicability of the HK theorems is still validated [56]. The kinetic energy of the real system T can be mapped to the exact kinetic energy of auxiliary systems  $T_S$  because of the density constraint. The expression for the kinetic energy of the uncorrelated system  $T_S$  in terms of Kohn-Sham orbitals takes the form as,

$$T_S = -\frac{\hbar^2}{2m_e} \sum_{i=1}^{N} \langle \xi_i | \nabla_i^2 | \xi_i \rangle$$
 (2.17)

The kinetic energies of the real and auxiliary system are related as under

$$T = T_S + T_C \tag{2.18}$$

Here  $T_C$  accounts for the residual forces in the kinetic energy of correlated electrons. The Eq. (2.16) can be modified as

$$F[\rho(r)] = T_S[\rho(r)] + J[\rho(r)] + T_C[\rho(r)] + E_{ncl}[\rho(r)]$$

$$= T_S[\rho(r)] + J[\rho(r)] + E_{XC}[\rho(r)]$$
(2.19)
(2.20)

Here, the residual contribution of the total kinetic energy and non-classically treated electrostatic potential are grouped in the form of  $E_{XC}$ , which is named as *the exchange and correlation energy*. The functional of total energy in Eq. (2.15) can be redefined as

$$E\left[\rho(\mathbf{r})\right] = T_S\left[\rho(\mathbf{r})\right] + \frac{1}{2} \iint \frac{\rho(\mathbf{r}_1)\rho(\mathbf{r}_2)}{|\mathbf{r}_1 - \mathbf{r}_2|} d\mathbf{r}_1 d\mathbf{r}_2 + \int d\mathbf{r} V_{ext}(\mathbf{r})\rho(\mathbf{r}) + E_{XC}[\rho(\mathbf{r})]$$
(2.21)

The above Eq. (2.21) contains the terms for the kinetic energy of the auxiliary non-interacting system, the classical Coulomb potential between the electrons, the external potential acting on electrons due to the presence of nuclei, and exchange-correlation energies, respectively. Combining the findings of KS formalism with the second theorem of HK provides the solution of the auxiliary KS system in the form of a Schrodinger-like single-particle KS equation as

$$H_{KS}(\mathbf{r})\xi_i(\mathbf{r}) = \left[ -\frac{\hbar^2}{2m_e} \nabla^2 + V_{KS}(\mathbf{r}) \right] \xi_i(\mathbf{r}) = \varepsilon_i \xi_i(\mathbf{r})$$
 (2.22)

Here,  $\xi_i(\mathbf{r})$ ,  $V_{KS}(\mathbf{r})$  and,  $\varepsilon_i$  denote the ith KS orbital, the KS effective potential, and eigenvalues of the  $H_{KS}$  operator, respectively. The effective potential  $V_{KS}(\mathbf{r})$  can be explicitly written in the form

$$V_{KS}(\mathbf{r}) = V_{ext}(\mathbf{r}) + V_H(\mathbf{r}) + V_{XC}(\mathbf{r})$$
(2.23)

Here, second term  $V_H(\mathbf{r})$  symbolizes the Hartree potential which is determined as

$$V_H(\mathbf{r}) = \int \frac{\rho(r_2)}{|r_1 - r_2|} d\mathbf{r}_2$$
 (2.24)

The last term in Eq. (2.23) represents the exchange and correlation potential which is not defined in the exact form, however, it can be defined as a derivative of the exchange-correlation energy functional  $E_{XC}[\rho(r)]$  with respect to the density  $\rho(r)$ .

$$V_{XC} = \frac{\delta E_{XC}[\rho(r)]}{\delta \rho(r)} \tag{2.25}$$

Finally, the expression for the ground state density can be written as

$$\rho(\mathbf{r}) = \sum_{i=1}^{N} |\xi_i(\mathbf{r})|^2$$
 (2.26)

The effective potential  $V_{KS}(\mathbf{r})$  can be obtained according to Eq. (2.23) by inserting  $V_H(\mathbf{r})$  and  $V_{XC}$  parameters. If the exact form of  $V_{XC}$  is known, the exact density and consequently the energy of the system at the ground-state can be computed by applying the self-consistent field (SCF) approach. This iterative method searches for the KS orbitals according to KS formalism and provides the solution of the KS equation, Eq. (2.22). The KS formalism provides the exact solution of the many-body system by mapping the real interacting system to the auxiliary non-interacting system having the same density. However, the exact form of the exchange and correlation potential  $(V_{XC})$  is still unknown and a research problem in itself, therefore the approximations are used for accurate determination of these parts of the energy.

# 2.3 Exchange-Correlation Functionals

In the KS formalism, the discrepancies between the real system of correlated particles and an auxiliary system of uncorrelated particles are merged under a single term, known as exchange and correlation functional [56]. The exact solution for this term is only known for a uniform electron gas (UEG). UEG is defined as an ensemble of interacting particles (electrons) spread over an infinite region with a uniform density  $\rho_0$ , neutralized by a uniform background density  $\rho_+$ . A sensible approach for obtaining the exchange and correlation potential of an infinite ensemble is to determine the energy density per each particle ( $\varepsilon_{XC}$ ) [57]. By separating the exchange and correlation parts of the energy density, one may conveniently write as,

$$\varepsilon_{XC}^{UEG}(\rho) = \varepsilon_X^{UEG}(\rho) + \varepsilon_C^{UEG}(\rho) \tag{2.27}$$

Exchange energy density can be analytically solved with the help of the following expression as [50, 54]

$$\varepsilon_X^{UEG}(\rho) = -\frac{3}{4}e^2 \left(\frac{6}{\pi}\rho_0\right)^{\frac{1}{3}}$$
 (2.28)

The correlation energy density can be analytically obtained for low and high-density regimes. The interpolation between these regimes is obtained with the help of Monte-Carlo algorithm combined with some other interpolation techniques [50, 57, 58]. The functional  $E_{XC}[\rho]$  for a real system of non-uniformly distributed particles can thus be approximated with the help of exchange  $\varepsilon_X$  and correlation  $\varepsilon_C$  energy densities.

### 2.3.1 Local Density Approximations (LDA)

Local Density Approximation (LDA) locally treats the exchange and correlation parts of the potential based on a UEG model, such that the density at each position  $\mathbf{r}$  is constant,  $\rho(\mathbf{r}) = \rho_0$ . As described earlier, the exchange term  $\varepsilon_X^{UEG}$  is analytically obtained with the help of Eq. (2.28). Similarly, a mapping between the regions of high and low electronic densities with the help of Monte-Carlo simulations depicts the correlation term  $\varepsilon_C^{UEG}$ . Typically, the accuracy of the LDA approximation depends on the use of interpolation schemes. By combining  $\varepsilon_X^{UEG}$  and  $\varepsilon_C^{UEG}$  terms, the exchange-correlation functional within LDA framework can be written as follows [58],

$$E_{XC}^{LDA}[\rho(\mathbf{r})] = \int \varepsilon_{XC}^{UEG}(\rho) \, \rho(\mathbf{r}) \, d\mathbf{r} = \int ([\varepsilon_X^{UEG}(\rho) + \varepsilon_C^{UEG}(\rho)]) \, \rho(\mathbf{r}) \, d\mathbf{r}$$
(2.29)

LDA is a simple approximation that is expected to work well only for the systems with slowly varying charge densities, such as those which nearly resemble a UEG, for example, metals with free and valence electrons. However, the error cancellation in the exchange and correlation terms produces reliable results for a vast variety of systems including insulators and semiconductors [59].

Besides several advantages, there are a few major shortcomings associated with LDA functionals. For instance, larger computational discrepancies are noted for the systems with highly inhomogeneous charge densities, such as isolated atoms and molecules. Moreover, overestimated binding energies and cohesive energies, and underestimated bond lengths and bandgaps are reported. Similarly, electron localization according to LDA is well-suited for the systems with s and p electrons, however, inaccurate results are produced for the systems containing d and f electrons. Van der Waals and hydrogen bonding are poorly depicted with the help of this approximation. Few examples of LDA functionals are Perdew-Zunger (PZ81) [60], Perdew-Wang-92 (PW92) [61] and Vosko-Wilk-Nusair (VWN) [62].

## 2.3.2 Generalized Gradient Approximations (GGA)

The shortcomings of the LDA could be improved to a great extent with the help of generalized gradient approximation (GGA). GGA is based on the assumption that  $\varepsilon_{XC}^{UEG}[\rho(r)]$  is not only a function of electronic density but also the gradient of electronic density at each position r. For the systems with inhomogeneous electronic density, the gradient of density ( $\nabla \rho$ ) is locally obtained for exchange and correlation parts. Based on this idea, the exchange-correlation functional [50] could be written as

$$E_{XC}^{GGA}[\rho(\mathbf{r})] = \int \varepsilon_{XC} \left[\rho(\mathbf{r}), \nabla \rho(\mathbf{r})\right] \rho(\mathbf{r}) d\mathbf{r}$$

$$= \int \varepsilon_{X}^{UEG}(\rho) F_{XC}[\rho(\mathbf{r}), \nabla \rho(\mathbf{r})] \rho(\mathbf{r}) d\mathbf{r}$$
(2.30)

Here,  $\varepsilon_X^{UEG}$  is the energy density of a UEG for exchange contribution.  $F_{XC}(\rho, \nabla \rho)$  is the enhancement parameter of GGA which depends on a dimensionless quantity, the density gradient, s, defined as

$$s = \frac{|\nabla \rho|}{2k_f \rho} \tag{2.31}$$

The enhancement parameter,  $F_{XC}$ , considers the degree of deviation from UEG character. Several forms of  $F_{XC}$  were proposed in the past, however, most commonly known are provided by Becke (B88) [63], and Perdew, Burke and Ernzerhof (PBE) [64].

Most of the computational work in this thesis is based on PBE approximation which works fairly well for predicting the physical and chemical properties of materials. GGA functionals are generally known to overcome most of the limitations of LDA, for example, accurate description of the chemical energy in metals and semiconductors as well as hydrogen bonding in materials [61, 65–67]. However, there are certain cases where the accuracy of GGA functionals is compromised, for example, the systems where van der Waals forces are dominant [68]. Similarly, GGA functionals are inaccurate for the materials with strong correlation effects or the systems where self-interaction error is non-negligible [50, 69, 70].

# 2.4 Van der Waals Interactions

The long-range forces termed as *Van der Waals (vdW) forces* typically originate from three different modes of interactions between the dipoles, for instance, the forces between two permanent dipoles, one permanent and another induced dipole, or a pair of induced dipoles (known as London dispersion force). The dipole-dipole forces sometimes play a dominant role in the formation of materials, for example, in the organic molecules. The intermolecular binding of those structures is inaccurately predicted with LDA and GGA functionals because of the missing non-local correlation effects in these functionals.

In this section, the origin, the significance and the treatment of London dispersion interaction in conjunction with DFT formalism is described. London-dispersion forces are long-range attractive forces that are related to the distance as  $R^{-6}$ , where R indicates the distance between the corresponding group of molecules or atoms [71–74]. The exchange and correlation functionals that are local or semi-local, do not incorporate the non-local effects. The inability

of LDA and GGA functionals to predict the dispersion interactions encourages the development of alternative methods that are cost-effective and accurate.

A useful approach for computing the correct total energy is to compute the total pairwise potential between the molecules and include it in the DFT energy (based on Kohn-Sham formalism). This method of adding the intermolecular potentials to account for dispersion interactions was employed by Grimme [75–77], Tkatchenko and Scheffler (TS) [78], and Becke and Johnson (BJ) [79]. For the computations in this thesis, we employed vdW corrections of Grimme known as DFT-D2 and DFT-D3 to compute the accurate adsorption energies of the atoms and molecules on various nanostructures. In these methods, the total energy is written as the sum of KS energy and dispersion energy ( $E_{dis}$ ) as

$$E_{DFT-D} = E_{KS} + E_{dis} (2.32)$$

 $E_{KS}$  is obtained utilizing a self-consistent approach based on Kohn-Sham formalism. The term  $E_{disp}$  is the empirically corrected pairwise potential, defined as follows

$$E_{disp} = -s_6 \sum_{i=1}^{N_a-1} \sum_{j=i+1}^{N_a} \frac{c_6^{ij}}{R_{ij}^6} f_{damp}(R_{ij})$$
 (2.33)

Here,  $s_6$  is a global scaling parameter and  $C_6^{ij}$  is a coefficient of dispersion for the  $\langle ij \rangle$  atomic pair. The dispersion coefficient is obtained by computing a geometric mean of the terms  $C_6^i$  and  $C_6^j$ . The distance between the *i*th and *j*th atom is indicated as  $R_{ij}$  and  $N_a$  account for the total number of atoms that are responsible for dispersion forces. The damping factor  $f_{damp}$  in Eq. (2.33) accounts for the long-range nature of the dispersion interactions.  $f_{damp}$  is expressed as follows

$$f_{damp}(R_{ij}) = \frac{1}{1 + e^{-d(R_{ij}/R_{r-1})}}$$
 (2.34)

Here, d is the adjustable entity and  $R_r = R_i + R_j$  is the total vdW radius obtained as a sum of the individual vdW radii of the *i*th and *j*th atom. This approach is very much time effective as compared to the self-consistent field procedure. However, the only problem is the non-flexible nature of  $C_6$  parameter which does not consider the local chemical behaviors of the concerning species. This issue is eliminated in the DFT-D3 formalism, where the dispersion coefficient can be adjusted with respect to the ligancy of the concerning species.

# 2.5 Computational Methods

### 2.5.1 Basis Sets

The development of DFT theory along with efficient exchange and correlation functionals provides adequate foundations for the quantum computations. However, for the practical implication as a computational tool, one needs to find ways to conveniently compute the KS wavefunctions,  $\xi_i$ , and eigenvalues,  $\varepsilon_i$ , for an infinitely large number of interacting electrons influenced by the static potential provided by a huge number of nuclei. To simplify the computations, the KS wavefunction,  $\xi_i$ , can be expanded in the form of basis set,  $\varphi_\gamma$ , and the coefficients,  $C_{i\gamma}$ , as follows

$$\xi_i = \sum_{\nu=1}^N C_{i\nu} \, \varphi_{\nu} \tag{2.35}$$

Here N corresponds to the number of each basis for the particular orbital. Eq. (2.35) is the mathematical expansion of  $\xi_i$  which can be inserted in the KS equations to reduce the problem to the form of a generalized matrix as follows

$$\left[ -\frac{\hbar^2}{2m_e} \nabla^2 + V_{KS}(\mathbf{r}) \right] \sum_{\gamma=1}^N C_{i\gamma} \, \varphi_{\gamma} = \varepsilon_i \, \sum_{\gamma=1}^N C_{i\gamma} \, \varphi_{\gamma} \tag{2.36}$$

The equation can be multiplied with the conjugate basis function,  $\varphi^*$ , and integrated over the corresponding volume element as follows

$$\sum_{\gamma=1}^{N} C_{i\gamma} \int_{V} \varphi^* \mathfrak{h}_{KS} \varphi_{\gamma} d\mathbf{r} = \varepsilon_i \sum_{\gamma=1}^{N} C_{i\gamma} \int_{V} \varphi^* \varphi_{\gamma} d\mathbf{r}$$
 (2.37)

here  $\mathfrak{h}_{KS}$  is given as,

$$\mathfrak{h}_{KS} = \left[ -\frac{\hbar^2}{2m_e} \nabla^2 + V_{KS}(\mathbf{r}) \right]$$
 (2.38)

The integral on the left-hand side in Eq. (2.37) is the KS Hamiltonian for a single particle which is symbolically represented as  $H^{KS}$ . Similarly, integral on the right-hand side represents the overlap matrix, S. Therefore, Eq. (2.37) can be symbolically expressed as

$$H^{KS}C = SC \tag{2.39}$$

Thus, the introduction of coefficients matrix,  $C_{i\gamma}$ , and eigenvalue matrix,  $\varepsilon_i$ , in the KS equations lead to the form of a generalized matrix which consists of KS Hamiltonian,  $H^{KS}$ , and overlap matrix, S. The solution of Eq. (2.39) is obtained by matrix diagonalization. Basis sets being the mathematical entities are written in various ways, however, *Plane Waves (PW)* offer several advantages for the systems where periodic boundary conditions are satisfied. In

this thesis work, PW basis sets are used for the treatment of periodic solid structures and molecules.

### 2.5.2 Periodicity in Solids and Bloch's Theorem

As stated in the previous section, the periodicity in solids is advantageous to further reduce the complexity of the many-electron problem. According to Bloch's theorem [80], the properties of the infinite number of electrons can be extracted by investigating only a finite number of electrons contained in a unit cell. The nature of the effective potential provided by the nuclei is periodic which further substantiates the application of periodic boundary conditions. Thus, KS orbitals can be written in the form of Bloch's periodic wavefunctions as under

$$\xi_{jk}(\mathbf{r}) = e^{i\mathbf{k}\cdot\mathbf{r}}u_{jk}(\mathbf{r}) \tag{2.40}$$

Here  $u_{k}(\mathbf{r})$  is a function that defines the periodicity of the crystal structure. Here, j stands for band index and  $\mathbf{k}$  is the wavevector which corresponds to the first Brillouin zone. The term,  $u_{jk}(\mathbf{r})$ , in Eq. (2.40) can be expanded by using the Fourier series as below

$$u_{jk}(\mathbf{r}) = \sum_{G} \frac{1}{\sqrt{\Omega}} c_{jk}(\mathbf{G}) e^{i\mathbf{G}.\mathbf{r}}$$
 (2.41)

Here,  $\Omega$  and  $c_{jk}$  indicate the volume of a primitive cell and the coefficients of expansion in the PW basis set, respectively. **G** represents the lattice vector in the reciprocal space, thus,  $\mathbf{G} \cdot \mathbf{r} = 2\pi m$ , where  $\mathbf{r}$  is a vector in the real space and m is the integer value. Thus, the KS orbitals in the form of PW basis set can be expressed as

$$\xi_{jk}(\mathbf{r}) = \sum_{G} c_{jk}(\mathbf{G}) \times \frac{1}{\sqrt{\Omega}} e^{i(\mathbf{k} + \mathbf{G}) \cdot \mathbf{r}}$$
(2.42)

KS equation is solved by setting a cutoff radius,  $k_{max}$ , for the reciprocal lattice which is the upper limit for the choice of Bloch's wavevector. This employs that the values  $k > k_{max}$  are not allowed. Similarly, KS orbitals are expanded as a linear combination of PW basis sets under periodic boundary conditions. Thus, by employing the plane-wave basis set and periodicity in the crystal lattice, the band structure is resolved by diagonalizing the Eq. (2.39) which generates the eigenvalues  $\varepsilon_j(k)$  and eigenfunctions,  $\xi_{jk}$ .

### Projector Augmented Wave Method

The computations in this thesis are employed using the VASP software which is based on the Projector-augmented wave (PAW) method. The PAW approach is based on the assumption that a many-body system is comprised of two types of regions. The non-overlapping spherical domains around the ions form the augmented region while the remaining parts of the system form the interstitial region, therefore, wavefunctions can also be separately treated for both the regions. The inside and outside of the augmented spherical domains are treated with partial and envelop wavefunctions, respectively [81]. The wavefunctions must coincide outside the augmented sphere and preserve continuity at the boundaries of the augmented spheres. Typically, plenty of oscillating wavefunctions are available around the core, therefore, computing a real wavefunction  $(\psi)$  for all-electrons could be tedious. A computationally efficient way is to map the all-electrons single atom wavefunction with the auxiliary or pseudo wavefunction  $(\psi)$  which is expressed in terms of the fewer basis sets. This pseudo wavefunction appears as an eigenfunction in the KS equation for a single atom.

Considering that the volume of the augmented sphere is  $\Omega_R$ , the pseudo wavefunction inside the volume,  $\Omega_R$ , can be formed by linear mixing of the partial-wave basis, the same procedure is followed for writing the all-electrons wavefunction. Hence,

$$|\psi(\mathbf{r})\rangle = \sum_{i} c_{i} |\phi_{i}(\mathbf{r})\rangle \qquad \text{inside } \Omega_{R} |\tilde{\psi}(\mathbf{r})\rangle = \sum_{i} d_{i} |\tilde{\phi}_{i}(\mathbf{r})\rangle \qquad \text{outside } \Omega_{R}$$
 (2.43)

Here,  $c_i$ ,  $d_i$  are the coefficients of expansion and i is the index for angular momentum (l, m) at a position R. Outside the augmented sphere, i.e. beyond a critical radius  $(r_c)$ , partial and all-electron waves are matching

$$|\phi_i(\mathbf{r})\rangle = |\tilde{\phi}_i(\mathbf{r})\rangle$$
 outside  $\Omega_R$  (2.44)

The partial wavefunctions for all-electrons and the pseudo part are connected with the help of an operator,  $\tau$ , as given below

$$|\psi\rangle = \tau |\tilde{\psi}\rangle \tag{2.45}$$

Here, 
$$\tau = \hat{\mathbf{1}} + \sum_{R} S_{R}$$
 (2.46)

The operator  $\tau$  provides a linear transformation pathway to connect the true all-electron wavefunction to the pseudo wavefunction. As given in Eq. (2.46),  $\tau$  is based on the identity operator  $\hat{\mathbf{1}}$  and the atomic contribution parameter,  $S_R$ , at a position R.  $S_R$  accounts for the differences between the all-electron and pseudo partial waves. Thus,

$$S_R |\tilde{\phi}_i\rangle = |\phi_i\rangle - |\tilde{\phi}_i\rangle \tag{2.47}$$

The projector operator  $|\tilde{P}_i\rangle$ , which fulfills the conditions (i)  $|\tilde{\phi}_i\rangle\langle\tilde{P}_j|=\delta_{ij}$  for i, j  $\in$  R and, (ii)  $\sum_i |\tilde{\phi}_i\rangle\langle\tilde{P}_i|=1$ , can be used to connect the interstitial and augmented regions. Thus, the new form of the auxiliary wavefunction is as follows

$$|\tilde{\psi}\rangle = \sum_{i} |\tilde{\phi}_{i}\rangle \langle \tilde{P}_{i}|\tilde{\psi}\rangle \tag{2.48}$$

Combining Eq. (2.45) to Eq. (2.48), the wavefunction for all-electrons can be written as below

$$|\psi\rangle = |\tilde{\psi}\rangle + \sum_{i} (|\phi_{i}\rangle - |\tilde{\phi}_{i}\rangle) \langle \tilde{P}_{i}|\tilde{\psi}\rangle \tag{2.49}$$

$$= |\tilde{\psi}\rangle + \sum_{R}(|\psi_{R}^{1}\rangle - |\tilde{\psi}_{R}^{1}\rangle) \tag{2.50}$$

here,

$$|\psi_R^1\rangle = \sum_{i \in R} |\phi_i\rangle \langle \tilde{P}_i | \tilde{\psi} \rangle \tag{2.51}$$

$$\left|\tilde{\psi}_{R}^{1}\right\rangle = \sum_{i \in R} \left|\tilde{\phi}_{i}\right\rangle \left\langle \tilde{P}_{i} \middle| \tilde{\psi} \right\rangle \tag{2.52}$$

The equations (2.51) and (2.52) represent the true all-electrons and auxiliary wavefunctions, respectively. Outside the spherical volume  $\Omega_R$ , these wavefunctions are equal i.e.,  $|\psi_R^1\rangle = |\tilde{\psi}_R^1\rangle$ . However, inside the augmented sphere,  $|\psi\rangle = |\tilde{\psi}_R^1\rangle$ . Based on these facts, we can rewrite the Eq. (2.49) as follows

$$|\psi\rangle = \left(\hat{\mathbf{1}} + \sum_{i} (|\phi_{i}\rangle - |\tilde{\phi}_{i}\rangle) \langle \tilde{P}_{i}|\right) |\tilde{\psi}\rangle \tag{2.53}$$

By comparing Eq. (2.45) and (2.53), the transformation operator ( $\tau$ ) can be written as

$$\tau = \hat{\mathbf{1}} + \sum_{i} (|\phi_{i}\rangle - |\tilde{\phi}_{i}\rangle) \langle \tilde{P}_{i}|$$
 (2.54)

Using the operator  $\tau$ , the new form of the KS equation is given as under

$$(\widetilde{H} - \varepsilon \widetilde{O}) |\widetilde{\psi}\rangle = 0 \tag{2.55}$$

Also,  $\widetilde{H} = \tau^{\dagger} H \tau$  and  $\widetilde{O} = \tau^{\dagger} \tau$ , where  $\widetilde{H}$  represents the pseudo-Hamiltonian. Hence, PAW ansatz simplifies the computations by expressing the all-electron Hamiltonian to a pseudo-Hamiltonian which is solved with the help of fewer plane waves.

### 2.5.4 Force Theorem

The minimum energy state of a system can be depicted based on the fact that the total forces acting on a system are zero at the equilibrium state. In other words, non-zero residual forces reckon the non-equilibrium state of the corresponding group of atoms. In computational quantum physics, the ground state of a system is achieved by minimizing the forces on atoms in a process called geometry optimization. Considering,  $F_N$  symbolizes the total force acting on the Nth nucleus at a position,  $R_N$ , then  $F_N$  can be written as

$$\mathbf{F}_N = -\frac{\partial E}{\partial \mathbf{R}_N} \tag{2.56}$$

Here, E is the total energy which can be expressed as

$$E = \frac{\langle \psi | H | \psi \rangle}{\langle \psi | \psi \rangle} \tag{2.57}$$

Considering that the KS orbitals  $\psi$  are normalized, i.e.  $\langle \psi | \psi \rangle = 1$  and substituting Eq. (2.56) in Eq. (2.57),  $F_N$  can be expressed as

$$F_{N} = -\left\langle \psi \middle| \frac{\partial H}{\partial R_{N}} \middle| \psi \right\rangle - \left\langle \frac{\partial \psi}{\partial R_{N}} \middle| H \middle| \psi \right\rangle - \left\langle \psi \middle| H \middle| \frac{\partial \psi}{\partial R_{N}} \right\rangle \tag{2.58}$$

Using  $H|\psi\rangle = E|\psi\rangle$  and  $\langle\psi|\psi\rangle = 1$ ,  $F_N$  simplifies to the following expression

$$F_{N} = -\left\langle \psi \left| \frac{\partial H}{\partial R_{N}} \right| \psi \right\rangle - E\left( \frac{\partial \langle \psi | \psi \rangle}{\partial R_{N}} \right)$$

$$= -\left\langle \psi \left| \frac{\partial H}{\partial R_{N}} \right| \psi \right\rangle \tag{2.59}$$

The Eq. (2.59) is known as the *Hellman-Feynman Force theorem* which states that the energy derivative for any variable equals the expectation value of the derivative of Hamiltonian [50]. DFT based electronic structure calculations use force theorem to predict the equilibrium structure in a process which computes the residual forces acting on atoms and moves the atoms in a way that the total forces can be minimized to zero (or typically to an acceptable force criterion of  $\sim 10^{-2} \text{ eV/Å}$ ).

### 2.5.5 Molecular Dynamics

Molecular dynamic (MD) simulations are widely used in the sciences for predicting the dynamic evolution of the system under consideration. The movements of the atoms and molecules are studied at a particular temperature for a specific interval of time. There are two different approaches for performing MD simulations, known as, classical molecular dynamics (CMD) and ab-initio molecular dynamics (AIMD). The basic difference lies in the strategy for computing forces on the atoms. The CMD approach uses Newtonian mechanics for predicting the forces using the following relationship

$$\mathbf{F}_i = m_i a_i = m_i \ddot{r}_i \tag{2.60}$$

Here, forces on atoms are predicted by generating the model potentials [82, 83]. This scheme is suitable and cost-effective for treating a large system where plenty of atoms and molecules are present. However, the accuracy of the computations is compromised because it does not account for the details such as charge transfer, bond formation, and bond dissociations, etc. On the other hand, AIMD computations are accurate but the treatment of a very large number of particles is not practical in terms of computational cost. The forces are computed in AIMD as follows

$$\mathbf{F}_i = -\nabla E_i = m_i \ddot{r}_i \tag{2.61}$$

In this thesis, AIMD simulations based on the Born-Oppenheimer model are used for predicting the thermal stability of the structures for the application as hydrogen storage media at ambient conditions.

Part II: Summary of the Results

## 3 Solid-State Materials for Hydrogen Storage

Hydrogen (H<sub>2</sub>) being a versatile carrier of energy can offer a CO<sub>2</sub>-neutral solution for fulfilling the energy demands of the world. A large part of the total energy consumption of the world, 30.3%, is attributed to the transportation sector [84]. Based on this fact, the transport sector could be a potential market for H<sub>2</sub> but its storage for transport applications is also a huge challenge. Currently, the vehicles based on batteries, H<sub>2</sub>, and hybrid batteries/H<sub>2</sub> are leading contestants of the transport industry. The combination of superior energy density and durability of the fuel cell in H<sub>2</sub> vehicles make them superior to battery vehicles. However, the H<sub>2</sub> industry suffers from the low density of H<sub>2</sub> gas which makes it difficult to stock an adequate amount of H<sub>2</sub> for onboard usage, for example, 5kg to roughly drive a distance of 500 miles [85]. US Department of Energy (DOE) has defined certain criteria for the H<sub>2</sub> storage system to be used in vehicles. According to those criteria, both gravimetric and volumetric capacity of H<sub>2</sub> are important factors to consider, which further implies that the total weight of the system and volume of the container should be reasonable for the range and size of the vehicle. Similarly, the recyclability of the storage system should not be less than 500 times and the charging times for the storage system should be short, most preferably 3-5 minutes [86, 87].

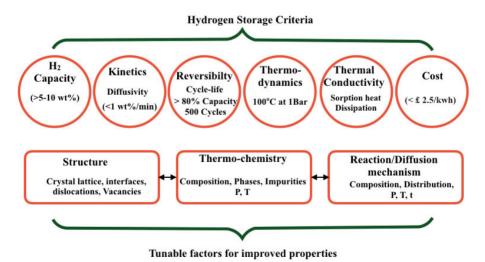


Figure 3.1. Practical limitations for onboard storage and the key factors to be improved.

The conventional ways of storing hydrogen under pressure and liquefaction face several limitations. For instance, compression (particularly at 700 bar) is an expensive process and a large amount of energy is expended during the gas storage. Besides that, special cylinders made of composite materials are required to withstand the pressure of 350 bar or 700 bar. Durability, weight, size. and shape of the cylinders cause potential concerns related to the safety of operation and practicality. For instance, gravimetric and volumetric capacities are affected by the aforementioned factors and the placement of cylinders inside the cars and smaller vehicles could be another problem. Similar kinds of packing challenges are offered by liquid hydrogen cylinders. Cryogenic storage or hydrogen liquefaction requires a temperature of 20 K which is crucial to maintain. The cost of the liquefaction is very high compared to the standard of DOE. The heat conductivity could also happen through walls of the cylinders or due to the higher surface area of the storage system, causing a boil-off which is extremely undesirable especially when a vehicle is parked in an enclosed area or garage for longer time period. The delivery tubes and internal walls of the storage tank need cooling as well because the loss of energy via hydrogen evaporation is quite probable. Due to these practical challenges and limitations, hydrogen storage via conventional compression and liquefaction techniques is not ideal for fuel cell vehicles. The unconventional approach, which is based on the capture of hydrogen inside the solid-state materials is preferred over conventional storage techniques due to the high gravimetric and volumetric capacities, cost-effectiveness, and safety of operation. There are two types of materials-based hydrogen storage techniques, namely chemisorption and physisorption, which will be discussed in the following sections.

## 3.1 Hydrogen Storage via Chemisorption

Hydrogen chemisorption typically means that  $H_2$  bond dissociates and a reaction of H atoms with the host material occurs according to the following equation

$$yM + \frac{x}{2}H_2 \rightarrow M_yH_x \tag{3.1}$$

Here M stands for the elements in the host material. H<sub>2</sub> molecule splits on the surface of the host and chemically reacts with other elements. Upon dissociation, H<sub>2</sub> can either bind to the surface or it can penetrate inside the bulk to occupy interstitial sites. Initially, a solid solution is formed due to the interstitial site occupation by H atoms but higher concentrations transform the structure to a new phase of a compound or a chemical hydride [88]. Being a very reactive element, hydrogen reacts with various elements resulting in the formation of compounds. These compounds are distinguishable from each other

depending on the type and nature of the elements and nature of the interaction between the hydrogen and the host. With light metals (such as alkali and alkaline earth metals), hydrogen forms ionic bond resulting in the formation of light metal hydrides or saline hydrides [89–92]. On the contrary, transition metal atoms and non-metals, form metallic/semiconducting, and covalent hydrides, respectively [93–96]. Similarly, complex hydrides are designed by a combination of hydrogen with the elements belonging to the group I-III of the periodic table, such as LiAlH<sub>4</sub> and LiBH<sub>4</sub>. For metal hydrides, a large weight of the system could lead to lower gravimetric densities. So far, achieving a reversible gravimetric capacity of 6 wt% along with cycling capability below 100°C (1bar) is a great challenge for metal alloys. Some light metal hydrides and complex hydrides are reported to exhibit high storage capacities but their thermodynamic conditions are not favorable for practical fuel cell conditions. Desorption of stored hydrogen requires increasing the temperature or reducing the pressure. The temperature/pressure requirements for adsorption and desorption processes act as the decisive parameters which entail the practicability of the storage media. Magnesium hydride is extensively investigated as a high capacity system for which the cycling temperature lower than 200°C (at 1Bar) could not be achieved [89, 97]. Aluminum hydrides, AlH<sub>3</sub> is another example of a thoroughly investigated chemical storage system that offers high capacity but the process of hydrogenation requires very high pressure which is economically not viable [98]. Complex hydrides, such as, borohydrides offer high storage capacities but reversibility is again problematic. The reversibility of tetrahydridobarates of metals (e.g., magnesium and transition metals) leads to the emission of diborane gas which is poisonous for fuel cell, moreover, continuous degradation of the material in terms of storage capacity due to the boron deficiency is reported [99, 100]. Besides practical challenges, the research on chemical storage systems is bristling with new ideas and evolving with time, and the quest for ideal storage system has intensified. Designing the alternate and efficient means of hydrogen storage with favorable thermodynamics and economic viability is momentous. In this context, molecular adsorption on material surfaces is considered an ideal solution that can offer fast kinetics and cost-effectiveness

## 3.2 Hydrogen Storage via Physisorption

The physically adsorbed  $H_2$  retains its molecular state and interacts with the host materials via weak van der Waals forces. The adsorption energy of  $H_2$  with host material is typically the order of  $\sim 0.1$  eV. To match the DOE standard established in 2010 for  $H_2$  gravimetric and volumetric capacities, a storage material should have a density around  $\sim 1$  g/cm<sup>3</sup> which means that the material's weight should be comparable to that of water. Fortunately, physisorption

is supported on the materials with a high surface-to-volume ratio, which consequently leads to higher gravimetric capacities. In this context, extensive investigations on the carbon nanotube (CNT), graphene, graphane, metal-organic frameworks, nanoribbons, zeolites, BN sheets, and several other lightweight systems were performed and reported in the literature [101–110]. Another advantage is related to the reversibility which is again attributed to weaker adsorption energies of H<sub>2</sub> with the host material. The weaker interaction of H<sub>2</sub> with the substrate can suffice faster kinetics (adsorption/desorption), the character which is lacking in the chemical storage systems. The desorption of H<sub>2</sub> from the surface happens without distorting the structure of the host. A small amount of energy can simultaneously dehydrogenate the whole surface of the storage media in a very short time interval. Since the H<sub>2</sub> desorption is an endothermic process, the leakage of H<sub>2</sub> from the storage material does not cause any explosion. Due to these remarkable traits and the synthesis of novel materials with high surface-to-volume ratio, H<sub>2</sub> storage via physisorption has boomed for several years.

## 3.2.1 Challenges of Hydrogen Physisorption

Concerning the DOE criteria for H<sub>2</sub> storage, hydrogen physisorption technique suffers from some unavoidable challenges. Storage capacity is greatly affected by the weight of the storage media, therefore, only the lightweight or porous materials can be ideal for H<sub>2</sub> storage. The light weight and high surface area of graphene seem promising for H<sub>2</sub> physisorption, however, the full coverage of H<sub>2</sub> on both sides of graphene could result in a storage capacity of 5 wt% which is not sufficient according to DOE criteria [111]. The small gravimetric capacity, in this case, is related to the adsorption geometries and distances between H<sub>2</sub> molecules. Since adsorbed H<sub>2</sub> molecules tend to keep a van der Waals distance of  $\sim 0.3$  nm between each other, therefore, only a limited number of molecules can be compensated on each side of the graphene sheet. To tackle the problem of storage capacity, the area of adsorbent surfaces must be comparable or greater than the area of graphene which is  $\sim 2600 \text{ m}^2/\text{g}$  [111]. Therefore, single-layered materials such as single-walled carbon nanotubes (CNTs), boron nitride (BN) sheets, and metal-organic frameworks (MOFs) are expected to yield higher storage capacities. MOFs showed great potential due to their high surface area (~ 3000 m<sup>2</sup>/g) and lightweight, as mostly these structures are porous and based on C atoms [105, 106, 112, 113]. The H<sub>2</sub> storage capacity of 6-8 wt% is reported for MOFs at around 77 K, however, the capacity drops to 1 wt% at 300 K. The drop in H<sub>2</sub> storage capacity is attributed to feeble van der Waals interactions between the H<sub>2</sub> and the adsorbent. H<sub>2</sub> adsorption at room temperature (300 K) can be achieved if the adsorption energy of H<sub>2</sub> is between 0.25–0.3 eV [111]. For smaller adsorption energies, one needs to provide low temperature or higher pressure conditions. This situation makes it challenging to store H<sub>2</sub> via physisorption under room temperature and pressure constraints.

In this scenario, it is crucial to design new materials with lightweight and large surface area which are capable to bind  $H_2$  with adequate adsorption strength. Introducing the topological defects or dopants on the surfaces, applying the electric field and functionalizing with foreign molecules could be suitable mechanisms for tuning the adsorption strength of  $H_2$  molecules on the sheet. In the next sections, the strategies for improving the adsorption energy and storage capacity of storage media are discussed along with some important results obtained from our computations.

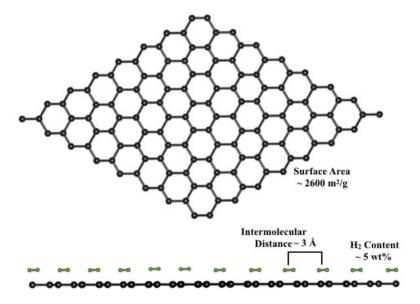


Figure 3.2. The storage capacity for fully hydrogenated graphene sheets with a surface area of  $\sim 2600 \text{ m}^2/\text{g}$  is only 5 wt%.

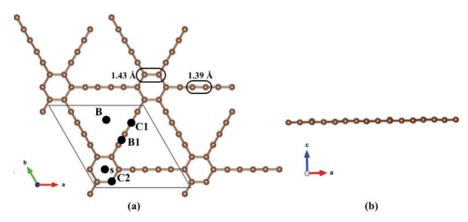
# 3.3 Strategies for Efficient Non-dissociative Hydrogen Storage

In the following sections, some of the important results from our studies are summarized. For the details of the computational methodology and results, please refer to the attached papers.

#### 3.3.1 H<sub>2</sub> Adsorption on Metallized Structures

#### 3.3.1.1 Metal-doped Graphdiyne sheets

As discussed in the previous section, a high gravimetric capacity for H<sub>2</sub> storage can be achieved when the adsorbent material is made up of light elements. such as carbon (C), boron (B), nitrogen (N), etc. In this regard, carbon-based single-layered structures are very interesting particularly those with large pore sizes. One such example is graphdiyne (GDY) nanosheet, which is experimentally synthesized very stable diacetylene allotrope of carbon. The geometrical structure of GDY sheets is shown in Figure 3.3. The lattice structure consists of large pores in the form of benzene rings with both sp and sp<sup>2</sup> hybridization of carbon atoms. The bandgap opening for the experimentally synthesized GDY sheet is reported as 0.46 eV [114]. GDY sheets are reported to show high mobility of electrons which is comparable with graphene [114]. Furthermore, catalytic abilities of GDY sheets for CO oxidation in the presence of Ag<sub>38</sub> cluster and metal-free oxygen reduction are reported elsewhere [115]. [116]. Due to the lightweight and large pore sizes, high H<sub>2</sub> uptake is possible on the surface of GDY sheets. However, tuning the adsorption energy of H<sub>2</sub> molecules to meet the room-temperature storage conditions is essential.



*Figure 3.3.* Top and side views of the planar GDY sheet. The unit cell enclosed by black lines consists of 18 atoms. Dotted (black) spots represent possible adsorption sites for adatoms. The C-C bond length for small and large pores are 1.43 and 1.39 Å, respectively.

We introduced light metal adatoms Li, Na, K, Ca, Sc and Ti on GDY sheets to capture the large number of H<sub>2</sub> molecules with improved binding strength. The top and side views of the unit cell of the GDY sheet having 18 atoms are shown in Figure 3.3. The structure consists of various binding sites for the adsorption of adatoms, for example, small pore (s) and large pore (B), C top in the large pore (C1), C top in the small pore (C2), and bridge site (B1), marked with black dotted spots in Figure 3.3. Adatoms were placed over all

the possible adsorption sites and the most stable site was the one with the strongest adsorption energy for the adatom. Initially, one adatom was allowed to adsorb on the sheet which prefers to bind at the large pore (B) site. Later, the interaction of the second atom was investigated in the presence of first adsorbed atom. The most favorable binding sites for all the metal adatoms was the hollow of the large pore (B). The adsorption energies, the distances between metal-sheet and metal-metal, and the bader charge per metal adatom are listed in Table 3.1.

**Table 3.1.** The adsorption energies (eV), the average distances  $D_{Metal-C}$  (between the metal adatom and the sheet) and  $D_{Metal-Metal}$  (between the adatoms), and charges on adatoms are listed.

Adatom	E <sub>ads (1 atom)</sub> (eV)	E <sub>ads (2 atoms)</sub> (eV)	D <sub>Metal-C</sub> (Å)	D <sub>Metal-Metal</sub> (Å)	Charge (e)
Li	-4.31	-2.28	2.21	4.76	+0.90
Na	-3.45	-2.00	2.81	5.46	+0.90
K	-4.30	-2.39	2.96	5.48	+0.90
Ca	-3.06	-3.23	1.41	3.78	+0.55
Sc	-5.19	-4.93	2.16	4.75	+2.04
Ti	-3.73	-5.23	2.09	4.88	+1.96

The adsorption energies for all the adatoms were strong enough to rule out the metal clustering, whereas, the adsorption energies of Sc and Ti were strongest amongst all the dopants. The adsorption energies were computed according to the following expression,

$$E_{ads} = E (DFT)_{GDY+M} - [E(DFT)_{GDY} + E(DFT)_{M}]$$
(3.1)

Here,  $E\left(DFT\right)_{GDY+M}$ ,  $E\left(DFT\right)_{GDY}$ , and  $E\left(DFT\right)_{M}$  are the total energies of the metallized GDY sheet, pristine GDY sheet, and the metal atoms, respectively. The total energy was computed using KS DFT along with GGA functional and van der Waals DFT-D3 correction. The electronic structure of the pristine and Li-, Sc-, and Ti-doped GDY sheets are plotted as the partial density of states (PDOS) in Figure 3.4. As compared to other metals, the strongest interactions of Sc and Ti atoms with the sheet were confirmed with the study of electronic structure. In Figure 3.4(c), the strong hybridization of Sc (3d) and Sc (4s) with C (p) states is noticeable near the Fermi level. Similarly overlapping Ti (3d) and Ti (4s) states with C (p) states near the Fermi level are visible in Figure 3.4(d). For further details of the electronic structure and charge transfer, readers are referred to Paper V.

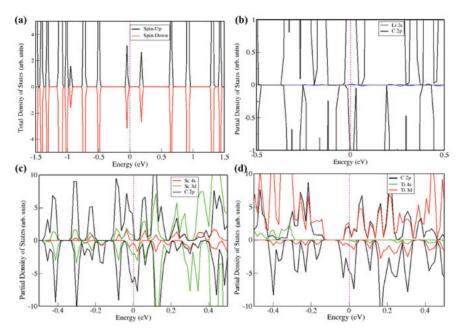


Figure 3.4. The electronic structure plotted as PDOS for (a) pure GDY sheet, (b) Li-(c) Sc-, and (d) Ti-doped GDY sheets. The metal doping turns the small bandgap semiconducting GDY sheets to metallic sheets. Reproduced with permission from Paper V. Copyright ©2018 IOP publishing Ltd.

The metallized structures were then exposed to H<sub>2</sub> molecules in different possible geometries. The number of H<sub>2</sub> molecules was gradually increased and gravimetric capacities for maximum hydrogenation cases were computed using the following formula,

$$H_2(G) = \frac{N_H \times W_H}{[(N_C \times W_C) + (N_M \times W_M) + (N_H \times W_H)]}$$
(3.2)

Here N and W represent the number and weight of atoms and M represents the metal atoms (M = Li, Na, K, Ca, Sc, and Ti). Each metal atom could capture maximum of four  $H_2$  molecules which yielded a high storage capacity of 6.50, 5.80, 5.20, 5.13, 5.0, and 4.91 wt% for Li, Na, K, Ca, Sc, and Ti-doped GDY sheets, respectively. The fully hydrogenated Li-doped GDY sheet which yielded the highest gravimetric capacity amongst all is shown in Figure 3.5. The binding/adsorption energies of  $H_2$  molecules were computed using the expression,

$$E_{ads} = \frac{[E_{M-GDY-nH2} - (E_{M-GDY} + nE_{H2})]}{n}$$
(3.3)

Here, n,  $E_{M-GDY-nH2}$ ,  $E_{M-GDY}$ , and  $E_{H2}$  represent the number of  $H_2$  molecules and the total energies of hydrogenated metallized GDY sheet, metallized sheet and  $H_2$  molecule, respectively.

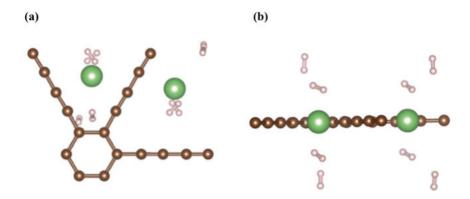


Figure 3.5. (a) Top and (b) side view of Li-doped hydrogenated GDY sheets. Each metal site could capture four  $H_2$  molecules leading to a high gravimetric capacity of 6.5 wt%. Here, brown, green and pink colors correspond to C, Li, and H atoms.

Here it is important to mention that  $H_2$  molecules interact with the GDY sheets via van der Waals forces which are challenging to accurately compute using DFT. The accurate computation of these forces requires the inclusion of exchange and correlation functionals. The unique feature of this paper is that three different functionals GGA, non-local vdW and DFT-D3 are used for the accurate computations of the adsorption energies of  $H_2$  molecules on the functionalized sheets. Regardless of the computational approach, adsorption energies of  $H_2$  are always adequate for room-temperature  $H_2$  storage. The adsorption energies for 4, 6 and 8  $H_2$  molecules computed with three different functionals are plotted in Figure 3.6.

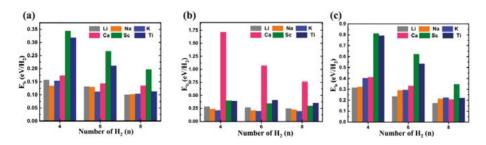


Figure 3.6. The average adsorption energies per  $H_2$  in cases of 4, 6 and 8  $H_2$  on metal functionalized GDY sheets computed by (a) GGA, (b) vdW-DF, (c) DFT-D3. Reproduced with permission from Paper V. Copyright ©2018 IOP publishing Ltd.

#### 3.3.1.2 Siligraphene (SiC<sub>7</sub>) sheets with light metals

In Paper III, a honeycomb planar structure named siligraphene (SiC<sub>7</sub>) was investigated for H<sub>2</sub> storage. As previously discussed, carbon-based structures are promising for H<sub>2</sub> storage applications particularly due to their light atomic weight, however, the binding of the H<sub>2</sub> molecules on several experimentally tested carbon nanostructures is weaker for practical storage conditions. As compared to CNTs, the adsorption energies of the H<sub>2</sub> molecules were reported to increase by 20% when adsorbed on silicon carbide nanotubes (SiCNTs), owing to the alternative charges located in the structure [117]. As reported, the electronic properties of silicon carbide ( $Si_xC_{1-x}$ ) monolayers (with 0 < x < 11) were greatly dependent on x, therefore varying the composition could result in outstanding and versatile characteristics [118]. The experimental synthesis of siligraphene (SiC<sub>7</sub>) monolayers was considered a breakthrough discovery due to the outstanding mechanical, electronic, and optical characteristics [119]. Similar to carbonaceous nanostructures, the interaction between H<sub>2</sub> molecules and pure SiC<sub>7</sub> sheets were weak (< 0.1 eV), therefore, doping with light alkali (Li, Na, K), alkaline earth (Mg, Ca) and transition metal (Sc, Ti) adatoms was chosen as a route for improved H<sub>2</sub> adsorption. We performed electronic structure calculations using the GGA-PBE method which depicted that pure SiC<sub>7</sub> is a semiconductor with a bandgap of 0.70 eV, whereas the experimental bandgap of 1.13 eV is reported elsewhere [119]. It is important to mention that the GGA-PBE method usually underestimates the bandgap. The accurate bandgap could be computed with the help of computationally expensive hybrid functionals, however, it was beyond the purview of this particular study. The adsorption of metal adatoms yielded a significant effect on the electronic structures of SiC<sub>7</sub> sheets. The interaction between the electronic states of adatoms and semiconducting SiC<sub>7</sub> sheets tuned the structure from semiconducting to metallic. The optimized geometry and electronic structure of pure SiC<sub>7</sub> sheets is shown in Figure 3.7.

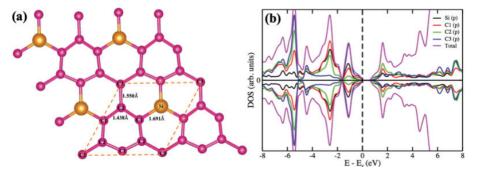


Figure 3.7. (a) The  $(2\times2\times1)$  supercell of SiC<sub>7</sub> sheet consists of 28 C and 4 Si atoms. (b) The electronic structure of SiC<sub>7</sub> shows a small bandgap of 0.70 eV. Reproduced with permission from Paper III. Copyright © 2018, Springer Nature

The  $E_{ads}$  values of adatoms were computed in a similar approach as in Eq. (3.1). Among all the adatoms, Mg showed a tendency for cluster formation, as the  $E_{ads}$  for Mg was lower than the reported cohesive energy ( $E_c$ ) [120]. Similarly, higher concentrations of Ti were prone to cluster formation, therefore  $H_2$  storage was not investigated for those cases. We further tested the possibility of dimer formation on the  $SiC_7$  sheets by investigating their adsorption behavior. The  $E_{ads}$  values of individual adatoms were stronger on the  $SiC_7$  sheets compared to corresponding dimers which suggested that formation of dimers is not favorable. Before hydrogenation, the thermal stability of metallized  $SiC_7$  sheets was investigated at 300 K for 6 ps using ab-initio molecular dynamics (MD) simulations. The results of MD simulations revealed that structures were stable at 300 K, which authenticated the reversibility of metaldoped  $SiC_7$  for room-temperature applications.

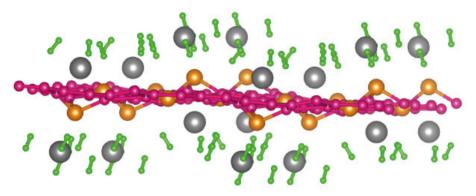


Figure 3.8. The extended view of the Li-doped SiC<sub>7</sub> sheet with maximum H<sub>2</sub> uptake. The adsorption energy of H<sub>2</sub> molecules is 0.286 eV. Here, pink, orange, grey and green colors refer to C, Si, Li, and H atoms, respectively.

Hydrogenation of the metallized  $SiC_7$  sheets revealed that each metal adatom could capture four or five  $H_2$  molecules and the maximum storage capacity was obtained for Li metal which is the lightest amongst all the adatoms. The structure of the hydrogenated Li-SiC<sub>7</sub> sheet is shown in Figure 3.8.

In Table 3.2, the average  $E_{ads}$  of metal adatoms, maximum storage capacity, and  $H_2$  adsorption energies are listed, which are the decisive parameters to find the potential of the  $H_2$  storage media. The ratio  $E_{ads}/E_c > 1$ , depicted the possibility of uniform and cluster-free distribution of adatoms on the  $SiC_7$  sheets. Our results revealed that highest  $H_2$  storage capacities of 6.34 and 5.63 wt% are obtained in the cases of Li and Na doped  $SiC_7$  sheets, respectively.  $E_{ads}$  values of  $H_2$  molecules on all the metallized  $SiC_7$  systems, except K, were found promising for fuel cell applications at room temperature.

**Table 3.2.** The adsorption energy of adatom on the sheet (eV), the ratio of adsorption energy to cohesive energy, the adsorption energy of  $H_2$  molecules in the vicinity of adatom (eV) and storage capacity (wt. %) for maximum dopant concentration (12.5%) are listed.

Adatom (12.5%)	$E_{ads}$ (metal) (eV)	$E_{ads}$ / $E_{coh}$	E <sub>ads</sub> (H <sub>2</sub> ) (eV)	Gravimetric density (wt.%)
Li-SiC <sub>7</sub>	-1.94	1.19	-0.29	6.34
Na-SiC <sub>7</sub>	-1.50	1.35	-0.24	5.63
K-SiC <sub>7</sub>	-1.96	2.10	-0.13	5.06
Ca-SiC <sub>7</sub>	-1.73	0.94	-0.27	5.03
Sc-SiC <sub>7</sub>	-4.55	1.17	-0.28	4.59

#### 3.3.1.3 Boron carbide (BC<sub>3</sub>) sheets under varied Scandium (Sc) doping

The introduction of metal dopants on relatively inert surfaces has proven to be an efficacious procedure that can enhance the reactivity of inert surfaces. This strategy is employed for the capture of gas molecules on nanostructures, particularly for the perspective of gas sensing and H<sub>2</sub> storage [121, 122]. However, the type of charged site (the metal dopant) further decides the binding enthalpy and the mode of interaction between a gas molecule and the doped nanostructure. The efficiency of AM doped carbon nanostructures is reported to decline under the effect of increasing temperature, this phenomenon is not ideal for H<sub>2</sub> storage at room temperature [123]. In the context of adequate H<sub>2</sub> adsorption enthalpy, TM dopants are superior to AM or AEM dopants due to a relatively stronger nature of the interaction between the d-orbitals of TM and the  $\sigma$  or  $\sigma^*$  orbitals of the H<sub>2</sub>. However, heavier TM atoms typically cause lower gravimetric capacities due to the large overall weight of the storage system. Another problem arises due to the cohesion of TM atoms as compared to their interaction with the nanostructure, which can hinder the non-uniform distribution of metal atoms on the surface. For higher H<sub>2</sub> uptake and reversibility, metal atoms should uniformly and strongly bind with the surface of nanosheet. For this reason, in the Paper I, we used scandium (Sc) atoms to manipulate the H<sub>2</sub> storage performance of BC<sub>3</sub> sheets. Furthermore, the effect of different doping concentrations on the metal-to-sheet and metal-H2 interactions were investigated. Based on the previous reports, we expected that the presence of boron atoms in the BC<sub>3</sub> sheet could facilitate the stronger metal-sheet interactions and hinder the metal-metal cohesion [124, 125].

Our computations based on vdW-corrected DFT with GGA-PBE functional depicted that  $BC_3$  sheets are capable to bind Sc atoms with adsorption energies -7.11, -6.02, and -5.45 eV in case of 3.12, 6.25, and 12.5 doping percentages, respectively. Thus, the adsorption energies of Sc were higher than the cohesive energies of Sc reported for the bulk structure [120]. The distances between the metal atoms were adequate for accommodating multiple  $H_2$  molecules. The binding between Sc atoms and the  $BC_3$  sheets was accompanied by the charge redistribution process. The quantification of the charge

transfer between metal and  $BC_3$  was performed with the help of bader technique. Each Sc atom gave a large fraction of its charge to the sheets and resulting positively charged Sc atoms were capable to polarize the  $H_2$  molecules. The adsorption of Sc on  $BC_3$  further affected the electronic structure, thus, a metal-to-semiconducting transformation of the doped  $BC_3$  sheets was noted.

**Table 3.3.** Average adsorption energies (eV) of  $H_2$  molecules on  $BC_3$  sheets in cases of different Sc content (Sc %).

No. of H <sub>2</sub> / Sc	E <sub>ads</sub> (eV) 3.12 (Sc %)	E <sub>ads</sub> (eV) 6.25 (Sc %)	E <sub>ads</sub> (eV) 12.5 (Sc %)
1 H <sub>2</sub> /Sc	-0.40	-0.44	-0.53
2 H <sub>2</sub> /Sc	-0.41	-0.43	-0.56
3 H <sub>2</sub> /Sc	-0.41	-0.41	-0.41
4 H <sub>2</sub> /Sc	-0.38	-0.33	-0.38
5 H <sub>2</sub> /Sc	-0.34	-0.31	-0.17

In the case of 12.5 Sc %, we observed the bond dissociation of one  $\rm H_2$  molecule which was situated in the vicinity between two Sc atoms. The charge analysis revealed that the higher charge accumulation in the region between two Sc atoms was responsible for the  $\rm H_2$  bond dissociation. For all the Sc doping concentrations, each metal site could adsorb five  $\rm H_2$  molecules with binding energies in the range of 0.53–0.17 eV. The gravimetric capacity in the case of highest Sc doping concentration was achieved as 5.5 wt %.

### 3.3.1.4 Li and Na doped Boron Phosphide (BP) sheets

The monolayers of the groups III-V elements, particularly h-BN, have received a huge research interest because of the outstanding mechanical, electronic, and optical properties. Similar to h-BN, boron phosphide (BP) monolayer is currently in the limelight due to its structural resemblance with graphene and h-BN. Theoretical predictions revealed that BP monolayer is a small bandgap (0.91 eV) semiconductor with high mechanical stability [126]. Similarly, the efficient performance of BP monolayer as an anode material for Li, Na, and K ion batteries was reported elsewhere [127]. In paper IX, we investigated the potential of BP monolayer as the H2 storage media. Similar to h-BN, the BP monolayer showed weak adsorption affinity for H<sub>2</sub> molecules. Therefore, for improvement of the adsorption strength, we introduced light AM atoms (Li and Na) on the BP structure. The study of electronic structure and charge transfer revealed that Li and Na atoms tend to transform the BP structure to metal, meanwhile, each metal atom loses the significant quantity of electronic charge to the BP sheet. We further verified the thermal stabilities of doped BP sheets for room temperature applications.

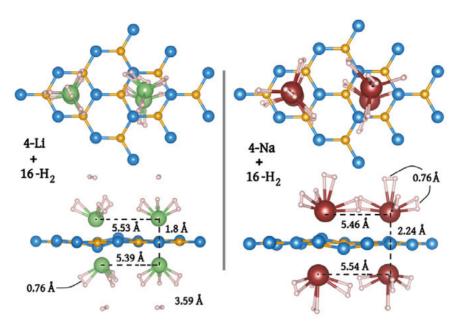


Figure 3.9. Adsorption of multiple H<sub>2</sub> molecules around Li and Na dopants on BP monolayer. Distances between the dopants and average H<sub>2</sub> bond lengths are mentioned for each structure. Here blue, orange, green, red and pink spheres represent B, P, Li, Na, and H atoms, respectively.

High gravimetric capacities of 7.402 and 6.446 wt% with adsorption energies in the range of 0.33-0.19 and 0.24-0.17 eV for Li and Na doped BP, respectively, suggested that BP monolayer could perform as a reversible H<sub>2</sub> storage medium for onboard applications.

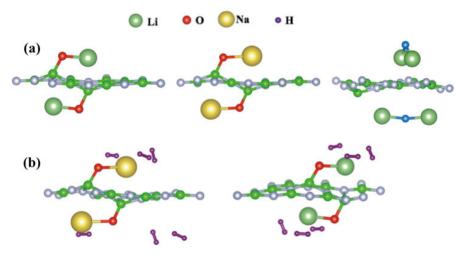
## 3.3.2 Molecular Functionalization for Enhanced H<sub>2</sub> Capture

Besides metal doping, H<sub>2</sub> storage performance of typically inert nanostructures (e.g., graphene, h-BN, CNTs) could be tuned by introducing molecular dopants, such as lithium-rich species or polar molecules which could bind H<sub>2</sub> via physisorption mechanism. The prerequisite for these molecules is the strong interaction with the host structures, which guarantees the reversibility of storage media. Amongst other molecular dopants, Li<sub>2</sub>F molecules on full-erenes C<sub>60</sub> were reported to improve the binding strength of H<sub>2</sub> molecules on the host [128]. Similarly, coatings of small polar molecules OLi and ONa on C<sub>60</sub> fullerenes were theoretically proposed for high H<sub>2</sub> gravimetric densities [129]. Lithium rich species known as polylithiated molecules captured particular attention in this context. Several examples of C and O based polylithiated molecules are available in the literature, for example, OLi, OLi<sub>2</sub>, OLi<sub>3</sub>, CLi, CLi<sub>2</sub>, CLi<sub>3</sub>, CLi<sub>4</sub> [130–133]. In the next sections, we have summarized our

projects where molecular dopants are employed as a tool for improved  $H_2$  storage performance.

#### 3.3.2.1 h-BN sheets with OLi, ONa, and Li<sub>2</sub>F molecules

In paper II, hexagonal boron nitride (h-BN) sheets functionalized with OLi, ONa, and Li<sub>2</sub>F molecules were investigated for H<sub>2</sub> storage. h-BN sheet, often known as an inorganic alternate of graphene, is mechanically and thermally stable wide bandgap semiconductor. The pristine h-BN structure shows inert behavior towards H<sub>2</sub> molecules which is similar to graphene. The interaction of H<sub>2</sub> and h-BN could be tuned by introducing light-weight molecular dopants on the sheet. Since OLi, ONa, and Li<sub>2</sub>F were reported to capture multiple H<sub>2</sub> on carbonaceous structures with optimum binding strength, therefore, the interaction of these molecules with h-BN sheets was investigated. For efficient H<sub>2</sub> capture, the molecular dopants were required to strongly bind with the h-BN sheet having adequate intermolecular separation to accommodate multiple H<sub>2</sub> molecules. In this context, different adsorption sites on the h-BN sheet were taken into consideration, such as hollow of hexagon, B and N top, and BN bridge sites. Different molecular orientations on the sheet were also investigated, for example, the OLi molecule could be vertically placed on the sheet in two possible geometries with either O or Li binding with the sheet or in a horizontal orientation parallel to the sheet. For each molecule, adsorption energies were computed in a similar fashion as in Eq. (3.1). The adsorption energies of OLi and ONa on h-BN were stronger than graphene and CNTs [129, 134].



*Figure 3.10.* Side views of (left to right) (a) OLi, ONa, and Li<sub>2</sub>F doped h-BN sheets. (b) OLi and ONa doped sheets with maximum H<sub>2</sub> uptake. Reproduced with permission from Paper III. Copyright © 2017, John Willey and Sons.

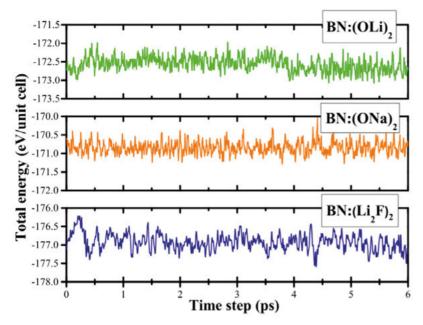


Figure 3.11. Molecular Dynamics (MD) simulation of doped h-BN sheets at 400 K with a time step of 1 ps. Plots represent the variation in energy with respect to time. Reproduced with permission from Paper III. Copyright © 2017, John Willey and Sons.

We further investigated the thermal stability of doped h-BN sheets at 400 K using MD simulations. The results of MD simulations are shown in Figure 3.11, which depicted that OLi and ONa doped sheets are thermodynamically stable at 400 K. On the other hand, the output structure and the variation in total energy (Figure 3.11) for Li<sub>2</sub>F doped h-BN sheets revealed the formation of the molecular cluster which weakly remained intact with the sheet. One of the Li<sub>2</sub>F molecules detached from the h-BN sheet and bound with the neighboring Li<sub>2</sub>F molecule. The weaker interaction of Li<sub>2</sub>F with the h-BN sheets suggested that this structure is not suitable for H<sub>2</sub> storage. However, OLi and ONa doped structures were further considered for H<sub>2</sub> storage studies.

For hydrogenation, each dopant molecule on h-BN sheets was initially exposed to the single  $\rm H_2$  molecule and the corresponding adsorption energies were obtained. The van der Waals corrected adsorption energies for first  $\rm H_2$  molecule on OLi and ONa doped structures were computed as 0.28 and 0.23 eV, respectively. The number of  $\rm H_2$  was then gradually increased to three per dopant and the total of 6  $\rm H_2$  molecules could be adsorbed on each system. The adsorption energies of  $\rm H_2$  in the case of maximum hydrogenation were 0.21 and 0.20 eV for OLi-BN and ONa-BN structures, respectively. These adsorption energies fall in the acceptable window (0.2 – 0.6 eV) for  $\rm H_2$  storage according to DOE criteria.

#### 3.3.2.2 Carbon Nanotubes (CNTs) with polylithiated Molecules

Carbon nanotubes (CNTs) have long been in the limelight for their outstanding mechanical, electrical and optoelectronic behavior. Earlier, experimental reports claimed that CNTs are capable to perform as an efficient H<sub>2</sub> storage material at room temperature with considerably high storage capacity (5-10 wt %) [135]. However, further studies depicted that H<sub>2</sub> binds with CNTs via weak Van der Waals forces which are not suitable for fuel cell applications [136, 137]. Meanwhile, surface coating with molecules or adatoms were employed to improve the adsorption enthalpy and storage capacity of CNTs [41, 138–141].

The unfulfilled quest for ideal  $H_2$  storage material inspired us to investigate CNTs doped with polylithiated molecules (PLMs). In Paper VI, we reported the structure, stability and  $H_2$  storage performance of CNTs doped with PLMs  $CLi_n$  (n=1,2,3) and  $OLi_m$  (m=1,2,3). The adsorption energies for PLMs were computed using the following equation,

$$E_{ads} = \left[ E \left( CNT - y CLi_n / OLi_m \right) - E(CNT) - y E(CLi_n / OLi_m) \right] / y \quad (3.4)$$

Here, m = n = y = 1,2,3. The total energies of CNTs with adsorbed PLMs, pure CNT, and PLMs are expressed as the first, second, and third term in the above equation. The electron density plots for all the doped CNTs are given in Figure 3.12.

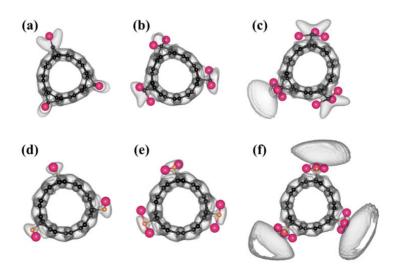


Figure 3.12. Electron density plots (cross-sectional view) for doped CNTs with (a) 3 CLi, (b) 3 CLi<sub>2</sub>, (c)3 CLi<sub>3</sub>, (d) 3 OLi, (e) 3 OLi<sub>2</sub>, and (f) 3 OLi<sub>3</sub>. Plots are obtained with an isosurface value of 0.4 e/bohr<sup>3</sup>. Here black, orange, and pink colors correspond to C, O, and Li atoms. Reproduced with permission from Paper III. Copyright © 2018 Elsevier B. V. All rights reserved.

The adsorption energies in case of three  $OLi_n$  (n=1,2,3) and  $CLi_m$  (m= 1,2,3) were -2.00, -1.51, -1.00, -3.08, -3.35 and -3.63 eV, respectively. The PDOS for  $OLi_3$  and  $CLi_3$  doped CNTs are plotted in Figure 3.13. The electronic structures of pure and functionalized CNTs show metallic behavior. The interaction of each PLM with CNT affects the electronic densities of states, therefore, a significant overlap of the Li (s), O (p) with  $C_{CNT}$  (p) states is observed in the case of  $OLi_n$  molecules. Similarly, overlapping  $C_{CNT}$  (p) with Li (s), C(p) states describes the strong chemical bonding between the  $CLi_m$  molecules and CNT.

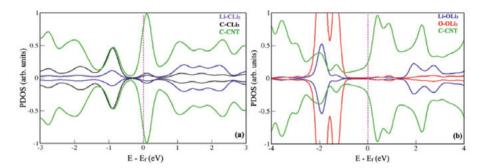


Figure 3.13. Partial density of states (PDOS) plots for doped CNTs with (a) CLi<sub>3</sub>, and (b) OLi<sub>3</sub> molecules.

The interaction of H<sub>2</sub> molecules and the functionalized CNTs is evaluated in terms of adsorption energies of the molecules, according to the following expression,

$$E_{ads} = [E (CNT - CLi_n / OLi_m + zH_2) - E (CNT - CLi_n / OLi_m + (z - 1)H_2) - E (H_2)]$$
(3.5)

Here, First and second terms are energies of the functionalized CNTs with z and z-1 H<sub>2</sub>. The third term considers the total energy of the H<sub>2</sub> molecule. It is important to mention that the vdW correction of Grimme is included to compute the accurate forces between the molecules and the host [76]. The structures OLi<sub>3</sub>-CNT and CLi<sub>3</sub>-CNT which yield maximum H<sub>2</sub> capture are shown in Figure 3.14. Large H<sub>2</sub> uptake with adsorption energies in the range (0.33 – 0.15 eV) suggested that CNTs doped with OLi<sub>3</sub> and CLi<sub>3</sub> molecules should be experimentally tested as the H<sub>2</sub> storage materials.

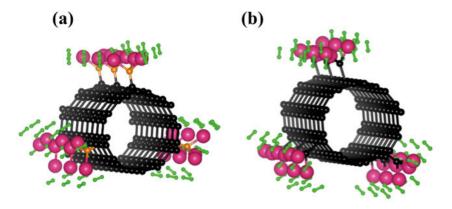


Figure 3.14. The structure of fully hydrogenated (a)  $OLi_3$  and (b)  $CLi_3$  doped CNTs yielding the maximum  $H_2$  capture. Black, pink, orange, and green colors correspond to C, Li, O, and H atoms, respectively.

# 4 Two-dimensional (2D) Structures for Gas Sensing Applications

Gas sensing is a process of identifying or quantifying the nature, presence and, properties of various pollutants, such as toxic molecules or organic vapors. Various pollutants are emitted in the atmosphere through industrial, transport and biological processes. Amongst them, gases such as carbon dioxide (CO<sub>2</sub>) and methane (CH<sub>4</sub>) enormously contribute towards global warming which is one of the biggest problems of the present era. These gases are produced from the combustion of fossil fuels and degradation of organic matter [142]. CH<sub>4</sub> in lower concentrations is non-hazardous, however, concentrations higher than 4.5 % in the air could be dangerous because of the combustible nature of this gas. Similarly, CO<sub>2</sub> which is an odorless and colorless gas causes headaches, dizziness, and shortness of breath with a concentration of 1-3 % in the air. Its concentrations above 3 % can cause hypercapnia, a condition that effects the pH value of blood and consequently leads to brain dysfunction and unconsciousness. Elevated concentrations of CO<sub>2</sub> above 5-10 % can lead to a sudden death [143]. Carbon monoxide (CO) is another side-product of the incomplete combustion of fossil fuels, which is reported to cause serious health issues including heart problems at concentrations above 100 ppm (parts per million) [144]. Industrial processes and combustion of sulfur contaminated fossil fuels result in the emissions of sulfur-containing toxic gases, for example, hydrogen sulfide (H<sub>2</sub>S) and sulfur dioxide (SO<sub>2</sub>). H<sub>2</sub>S which smells like a rotten-egg causes irreversible damage to the tissues at the concentrations higher than  $3\times10^{-3}$  % [143]. Similarly, SO<sub>2</sub> causes mild to severe problems in the eyes, nose, skin and the respiratory system. Besides above-mentioned gases, monitoring and detection of nitrogen oxides (NO<sub>x</sub>) and ammonia (NH<sub>3</sub>) are also crucial due to their adverse effects on the climate and public health [145]. Such gases are produced through natural, agricultural and industrial factors such as lightning strikes, agricultural fertilizers/manures, and fuel combustion. Serious health hazards of NO<sub>x</sub> and NH<sub>3</sub> at higher concentrations include metabolic and hematologic problems, abnormal blood pressure, vomiting, diarrhea, and respiratory failures. Gas sensor devices based on different types of materials are being utilized for the sensing of these molecules, such as conducting polymers, semiconducting metal oxides, graphene, and CNTs. This chapter summarizes our results of DFT based computations on 2D materials for their prospective gas sensing applications. Before discussing the performance of sensing materials, it is important to understand the mechanism behind the gas sensing and important parameters related to the sensing performance.

## 4.1 Basic Mechanism of Gas Sensing

The conventional metal oxide sensors usually offer the advantage of cost-effectiveness and sensitivity, however, higher temperatures and large power are required for the normal operation. Within a required range of operating temperature (typically 200 to 500 °C), oxygen ions adsorbed on the surface of metal oxide materials react with incident gas molecules and resulting changes in the conductivity of metal oxides are measured. These oxygen ions (O<sup>2</sup>, O<sup>2</sup>, and O<sub>2</sub>) negatively charge the surface, therefore, an increase in the conductivity of metal oxide is observed when an electron donor molecule interacts with the oxygen ions and donates the negative charge. Likewise, the electron acceptor gas interacts with the ions and receives a negative charge, hence the conductivity of sensing material decreases [146]. The mechanism of gas sensing in graphene and other analogous structures is different from metal oxide sensors. In those cases, charge transfer directly occurs between the nanosheet and the gas molecules. Incident gas molecules can either accept or donate the charges to the sensing material [147]. The amount of charge transfer and the direction of charge depletion affects the resistance of sensing materials. The sensing material retains its initial resistance when gas molecules are desorbed due to the temperature or pressure changes. This mechanism of gas detection is reported for various nanosheets including MoS<sub>2</sub>, graphene, ZnO, and Ti<sub>2</sub>CO<sub>2</sub> MXenes [148–151]. In Figure 4.1, the distribution of surface charge density for V<sub>2</sub>NS<sub>2</sub> MXene with adsorbed NH<sub>3</sub> molecule is plotted which shows that the gas adsorption on V<sub>2</sub>NS<sub>2</sub> MXene causes a depletion of negative charge ~ 0.048e from NH<sub>3</sub> molecule to the sheet. The detailed charge analysis of NH<sub>3</sub> molecule depicted that N atom carries a negative charge ~1.207 e and H atoms on average lose a charge  $\sim 0.4$  e.

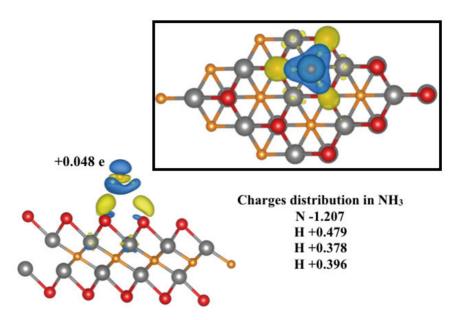


Figure 4.1. Isosurface charge density distribution for  $V_2NS_2$  MXene sheet with adsorbed NH<sub>3</sub> molecule. Positive and negative regions of charge are blue and yellow, respectively. The NH<sub>3</sub> molecule loses a net charge of  $\sim 0.048$  e to the surface. Here, Red, Grey, light green and orange spheres indicate S, V, H and N atoms, respectively.

#### 4.2 Gas Sensors Based on 2D Nanostructures

The sensing performance is quantified based on the parameters such as sensor response, stability, selectivity, sensitivity and recovery periods. Several sensors are designed and utilized till date, however, some of the required performance criteria are not fulfilled or the operating conditions are strenuous. Semiconducting metal oxide sensors are low cost and sensitive materials which are conventionally used for gas sensing but suffer from low selectivity and difficult operating conditions (for example, operating temperature and power consumption) [152]. On the contrary, CNTs are reported to manifest high selectivity and sensitivity at room temperature but extended recovery periods limit their applicability [48]. The hunt for efficient sensing material possessing high sensitivity and selectivity with desired operating conditions has resulted in the persistent development of novel 2D nanostructures. Hereof, graphene and analogous structures with extraordinary mechanical attributes, the large surface area for gas adsorption, and fast carrier mobility are reported as efficient sensors. Examples include graphene oxides (GO), h-BN, transition metal dichalcogenides (TMDs), silicene and phosphorene monolayers in pure and functionalized forms [147]. Despite appreciable attempts for designing

and developing materials, several factors still hinder the efficiency of nanoscale gas sensors, e.g., low sensitivity for some pollutants, poor selectivity, irreversible adsorption, and sensitivity to environmental factors. The sensitivity of a sensor is mainly affected by two factors (a) electrical noise and (b) quality/strength of the signal. Most of the sensing materials suffer from these problems, therefore, the quest for ultrasensitive nanomaterial remains unsatisfied [153]. In this context, we theoretically investigated the capability of Sterminated nitride MXenes (Paper VII) and functionalized BC<sub>3</sub> sheets (Paper VIII), as summarized in the following sections.

#### 4.2.1 MXene Sheets

The first MXene sheet was synthesized in 2011 and after that several new members emerged in the family with outstanding attributes, such as high thermal and mechanical stability, flexibility, acid-resistance and superior capacity of ion-exchange [154, 155]. The extraordinary role of MXenes for batteries, hydrogen storage, catalysis, supercapacitors, and gas sensing applications are reported in the literature [153, 156–159]. The ultra-high sensitivity of Ti<sub>3</sub>C<sub>2</sub> MXene for Volatile Organic Compounds (VOCs) makes it superior to graphene and MoS<sub>2</sub> gas sensors. The detection of VOCs in exhaled breath with a part per billion (ppb) accuracy could be achieved due to the low noise and high quality of the signal in the MXene sensor [153]. Here, we theoretically investigated the sensing properties of one of the thinnest MXenes M<sub>2</sub>N (M=Ti, V). In our study, we considered sulfur(S) terminations on M<sub>2</sub>N MXenes which were previously not studied for gas sensing, however, their remarkable behavior for anode applications in batteries was reported [160].

**Table 4.1.** The structural parameters for  $M_2N$  (M=Ti and V) sheets with and without the surface terminations.

Structure parameters (Å)	Ti <sub>2</sub> N	$Ti_2NS_2$	$V_2N$	$V_2NS_2$
Lattice constant	2.93	3.16	2.83	3.09
D <sub>Metal-Metal (In-plane)</sub>	2.86	2.96	2.69	2.75
D <sub>Metal-Metal</sub> (Out-of-plane)	2.93	3.16	2.83	3.09
D <sub>Metal-Nitrogen</sub>	2.04	2.16	1.97	2.06
D <sub>Metal-Sulfur</sub>		2.39		2.35

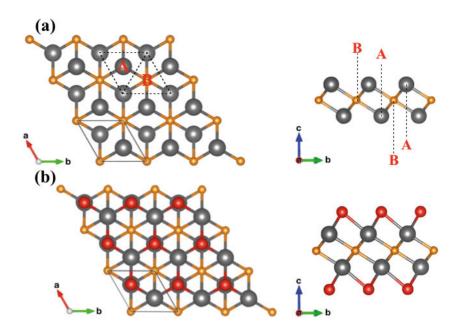


Figure 4.2. Top and side views of (a) Relaxed  $V_2N$  MXene sheet without surface terminations. The region enclosed by solid lines indicates the unit cell. The hollow sites of triangles A and B (enclosed by dotted lines) denote the possible adsorption sites for surface terminating atoms, and (b) Relaxed  $V_2NS_2$  MXene sheets. Here, Red, Grey, and orange spheres indicate S, V, and N atoms, respectively.

The structure of 2D transition metal carbides/nitrides is described with a chemical formula  $M_{n+1}AX_n$  ( n=1, 2, or 3), where "M" is the transition metal, "X" stands for C or N, and "A" element belongs to group IIIA or IVA in the periodic table [161, 162]. MXenes are terminated with surface terminal groups (T= O, F, OH or S) and the properties of these sheets are distinctive based on the type of their surface terminations. The unit cell of Ti<sub>2</sub>N and V<sub>2</sub>N sheets were first relaxed and then S adsorption on both sides of the sheets was achieved. Transition metal ions can generally form six bonds with the surrounding atoms due to the coordination number 6, therefore, the surface terminated structures M<sub>2</sub>NS<sub>2</sub> are formed. S atoms could adsorb on two types of hollow sites (A and B), as highlighted in Figure 4.2(a). We checked four different possibilities for both sided surface terminations and named them as models 1, 2, 3 and 4. In model 1, hollow A sites were chosen for both sides S coverage. Similarly in model 2, S atoms were allowed to relax at hollow B sites. In Model 3, the possibility of S adsorption on top of the transition metal atoms was tested. In model 4, S atom on one side of the sheet adsorbs on A site and on the other side it adsorbs at the B site. The structure of Ti<sub>2</sub>N MXene with and without the surface terminations are shown in Figure 4.2(a-b), respectively. Detailed description of the structure and our computational methodology are contained in paper VII. We investigated the adsorption behavior of eight gases  $CH_4$ , CO,  $CO_2$ ,  $SO_2$ ,  $H_2S$ ,  $NO_2$ , NO, and  $NH_3$  on  $Ti_2NS_2$  and  $V_2NS_2$  MXene sheets. The adsorption energies are computed using the following formula,

$$E_{ads} = E_{MXene+Gas} - E_{MXene} - E_{Gas} (4.1)$$

here, first, second and third terms in the above expression represent the total energies of the MXene sheet with the adsorbed molecule, pristine MXene sheet, and the gas molecule, respectively.

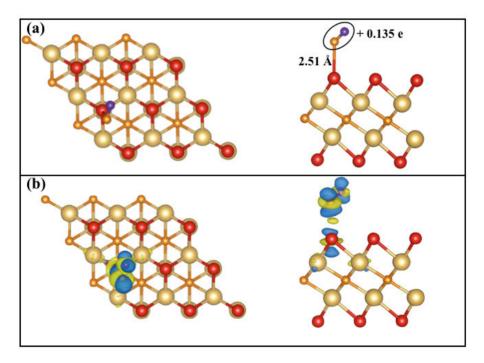


Figure 4.3. Top and side views of (a)  $Ti_2NS_2$  sheet with adsorbed NO molecule. The net charge on the molecule is +0.135 e. The distance between the molecule and sheet is 2.51 Å. (b) Isosurface charge density plot for NO molecule adsorbed on the  $Ti_2NS_2$  sheet. Yellow and blue colors indicate the negative and positive charge regimes, respectively. Red, golden, and orange spheres indicate S, Ti, and N atoms, respectively.

The adsorption of gases on  $M_2NS_2$  sheets leads to the charge redistribution on the surface and affects the electronic structure of the MXene sheets. Charges on the adsorbed molecules and MXene sheets were quantified with the help of bader charge technique. Here, it is worthwhile to mention that  $E_{ads}$  values of atoms and molecules reported in this thesis are always negative because the

interactions are exothermic and kinetically favored. Adsorption studies revealed that both MXene sheets show comparatively stronger interactions with the molecules NO, NO2, H2S, and SO2. Eads values in most cases fall in the physisorption or weak chemisorption regime of molecular interactions with the sheets, which is suitable for efficient and fast recovery of the sensing device after gas detection. Charge analysis describes that CO<sub>2</sub> and SO<sub>2</sub> act as charge acceptors on both the sheets and receive some fraction of electronic charges from the nearest atoms on the host. The NO molecule gets adsorbed on the Ti<sub>2</sub>NS<sub>2</sub> sheet with the strongest adsorption affinity (-0.406 eV) amongst all. The structure and isosurface charge density for NO molecule on the Ti<sub>2</sub>NS<sub>2</sub> sheet are shown in Figure 4.3. The adsorption process leads to a reshuffling of the surface charges and the NO molecule carries a net charge equal to +0.134 e. The careful analysis of the charges by bader technique reveals that the N atom in the NO molecule donates the charge equivalent to 0.160 e to the sheet and O atom receives the charge 0.026 e. As a consequence of the charge donation, the bond length of the NO molecule reduces to 1.16 Å, whereas the pre-adsorption bond length is 1.17 Å. The adsorption of molecules also affects the electronic structure of MXene sheets which plays a vital role in the gas detection. The total density of states (TDOS) plot for NO molecule adsorbed on Ti<sub>2</sub>NS<sub>2</sub> sheets is shown in Figure 4.4.

Here, a significant effect of NO adsorption on the electronic structure is visible around the Fermi level, as the peaks become broader and shift towards the Fermi level. NO molecule is paramagnetic in the gaseous state, therefore, the molecule induces magnetism in the  $Ti_2NS_2$  sheet upon adsorption. Similar investigations on all the gases revealed that both  $M_2NS_2$  sheets show high sensitivity towards NO,  $NO_2$ ,  $H_2S$ , and  $SO_2$  molecules. Particularly, the adsorption energies of NO and  $NO_2$  molecules are favorable for reversible gas sensing, which means that gases can be detected on the MXene sheets and later the structure can quickly retain its pristine state. Our findings reveal that the  $Ti_2NS_2$  and  $V_2NS_2$  sheets can function as efficient nanosensors materials for NO and  $NO_2$  molecules. Sensing of the material for other gases is comparatively lower but we expect that it could be enhanced by applying the external electric field or tensile strain as previously achieved for the  $Sc_2CO_2$  and  $Ti_2CO_2$  MXenes-based  $SO_2$  and  $NH_3$  sensors.

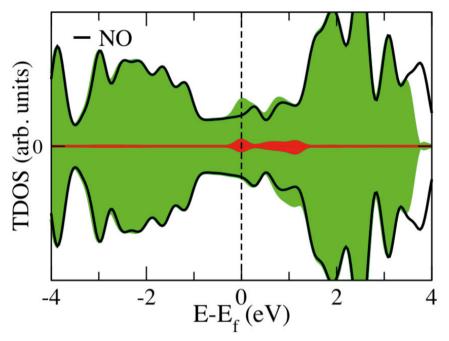


Figure 4.4. Total density of states (TDOS) plot for NO molecule adsorbed on the  $Ti_2NS_2$  sheet. The red shaded region represents the projected DOS for the NO molecule. The black solid line indicates the TDOS for the  $Ti_2NS_2$  and the green shaded region represents TDOS of the  $Ti_2NS_2$  after NO adsorption.

## 4.2.2 Metal Functionalized BC<sub>3</sub> Sheets

Carbon-based nanomaterials, particularly graphene, hold great potential for the applications in the field of nanoscale gas sensing owing to a large surface area, superior conductivity, and fast mobility of electrons. Reduced electrical noise in graphene compared to the conventional sensors creates the possibility of an exceptional gas sensing response. Similarly, humidity which acts a limiting parameter for the performance of the gas sensors, no longer remains an issue because the graphene-based sensors are reported to overcome humidity related sensing issues without external heating [163]. Dopants and defects can further enhance the sensitivity of graphene and other carbon-based nanostructures. The properties of graphene, however, greatly vary depending on the type of dopant, for instance, boron (B) doping in graphene could enhance the sensitivity for NO and NO<sub>2</sub> molecules [164]. The size of the B atom is similar to C, which makes it feasible to design B-C based functional materials. The experimental synthesis of the BC<sub>3</sub> sheet is one such milestone discovery that opened up the possibility to design a sensor with exceptional sensitivity and selectivity. The structural resemblance with graphene, semiconducting nature, high strength and mechanical stability, good optical response, and heat conductivity make BC<sub>3</sub> sheets interesting for nanoscale device applications.

In Paper VIII, we investigated the gas sensing performance of BC<sub>3</sub> sheets for carbonaceous pollutants CO, CO2, and CH4. The adsorption energies of molecules were computed on pristine BC<sub>3</sub> sheets which revealed that the CH<sub>4</sub> weakly binds to the BC<sub>3</sub> sheet with an adsorption energy of 0.14 eV. Likewise, the weak physisorption governs the interaction of CO<sub>2</sub> with BC<sub>3</sub> sheet with a adsorption strength of 0.19 eV. The adsorption energy of CO molecule (0.74 eV) depicts a relatively higher sensitivity of pristine BC<sub>3</sub> sheets for CO as compared to the other two gases. To enhance the sensitivity of BC3 sheets for CO<sub>2</sub> and CH<sub>4</sub> molecules, we employed the metal-doping strategy. Previously metal dopants, such as, aluminum (Al) and lithium (Li) were reported to improve the sensitivity of graphene- and hydrogenated graphene-based sensors, respectively [165, 166]. Here, we doped BC<sub>3</sub> sheets with light AM (Li, Na, K) and AEM (Be, Mg, Ca) atoms and observed the enhanced sensing aptitude of the metal-doped sheets. Pristine BC<sub>3</sub> sheets were semiconducting with an indirect bandgap of 0.65 eV. Metal atoms strongly adsorbed on the pristine BC<sub>3</sub> sheets and donated the bulk of their atomic charges to the sheet. Metal adatoms could bind with the BC<sub>3</sub> sheet uniformly without cluster formation, which is an important attainment towards material design. The electronic structure of the BC<sub>3</sub> sheets turned metallic upon metal doping as the new electronic states emerge around the fermi level. In Figure 4.5(a-b), the adsorption geometry, the partial electronic density of states (PDOS) and isosurface charge density are shown for Li doped BC<sub>3</sub> sheets.

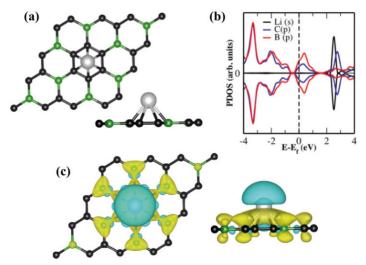


Figure 4.5. (a) Top and side views, (b) Partial density of states (PDOS) plot, and (c) Isosurface charge density distribution for Li doped BC<sub>3</sub> sheets. Here green, black, and silver spheres represent B, C, and Li atoms, respectively.

To estimate the sensitivity of doped BC<sub>3</sub> sheets for gas molecules, we investigated the charge distribution, electronic structure and work function of the

 $BC_3$  sheets before and after the gas adsorption. The work function which is computed as a difference of electrostatic potential at the level of vacuum and the energy at the Fermi level, is a useful parameter to detect gases. Particularly, surface work function variation (SWF) sensors work on the principle of the work function measurement as the gases adsorb on the sensitive surface. Our computations revealed that the work function of the sheets before and after the gas adsorption significantly changes owing to the sensitive nature of doped  $BC_3$  sheets for all the gas molecules. In Figure 4.6(a-c), the total density of states (TDOS) for Li doped  $BC_3$  sheets with and without CO,  $CO_2$ , and  $CH_4$  adsorption are plotted. The change in TDOS after the gas adsorption, particularly near the Fermi level, facilitates the process of gas detection.

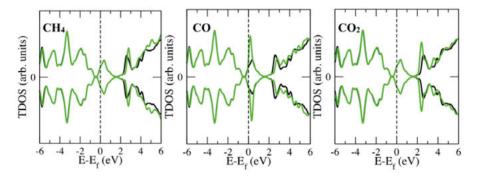


Figure 4.6. Total density of states (DOS) plots for Li doped BC<sub>3</sub> sheets with CH<sub>4</sub>, CO, and CO<sub>2</sub> molecules (Left to right). Green and black lines indicate the TDOS of Li doped BC<sub>3</sub> with and without adsorbed gases, respectively.

# 5 Tuning the Structure and Electronic Properties of 2D Materials

Design and synthesis of novel materials are constantly revolutionizing the electronic industry for almost the last 75 years. Research on 2D materials is increasing day by day and new members are being added to the family, namely, graphene, hydrogenated-graphene, graphyne, graphone, graphdiyne, silicene, germanene, silicane, phosphorene, antimonene, arsenene, borophene, hexagonal boron nitride, boron carbide, MXenes and transition metal dichalcogenides (TMDs). These materials have captured great interest owing to their outstanding and diverse chemical, electrical, optical, mechanical and electronic characteristics. Amongst other 2D materials, graphene, TMDs, and MXenes are being tested for the fabrication of the nanoscale electronic devices. However, except graphene, none of the available 2D materials has yet been commercially employed for large-scale manufacturing of the devices [167]. For improved performance, tuning or readjustments of the material properties by means of doping, chemical modifications, electric field, compression, and strain is often required.

With advanced computational tools, now it is possible to access the properties of materials under the effect of external tuning parameters. Theoretical predictions of the material properties under varied external factors not only facilitate the experimental design and testing but also provide a better picture of the ongoing physical phenomena. In this chapter, the role of adatoms/dopants on the properties of 2D stanene sheet is discussed. Detailed results and methodology of our theoretical investigation are available in paper IV.

## 5.1 Doping Characteristics of Stanene Monolayer

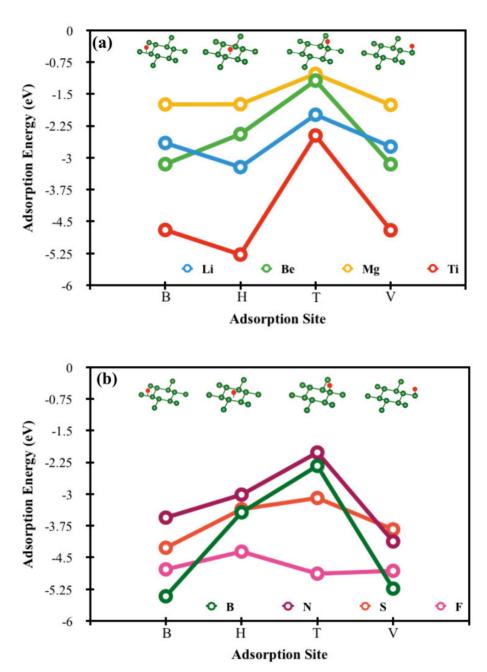
Stanene, as the suffix *ene* suggests, is an elemental 2D material composed of Sn atoms. This monolayer is semiconducting with a small bandgap (72 meV) and manifest structural similarity with other group IV monolayers, namely, silicene and germanene [168]. Semiconducting nature, high dynamic stability, and room-temperature Quantum Anomalous Hall (QAH) effect make it interesting for the optoelectronic industry [169]. Previous studies revealed that doping with adatoms could enhance the potential of 2D structures for various applications, e.g., hydrogen storage, photocatalytic activity, super-capacitance

and gas sensing performance [160, 170–173]. We, hereby, investigated the structural distortions and electronic properties of pristine and doped stanene monolayers with 31 different adatoms from AM (Li–K), AEM (Be– Ca), TM (Sc–Zn) and metal/non-metals (Al, Ga, B, Si, Ge, As, C, N, O, P, S, Se, F, Cl, Br) of groups III-VII in the periodic table. We further investigated the adsorption energies, charge transfer, and change in the surface work function for doped stanene sheets.

### 5.1.1 Adsorption Energies and Diffusion Pathways

Stanene monolayer is a buckled structure consisting of hexagonal rings of sp<sup>3</sup> bonded Sn atoms. The adsorption sites for adatoms are H (hollow), B (bridge), T (top), and V (valley), as indicated in Figure 5.1. We investigated the adsorption behavior of all the adatoms on these four adsorption sites. The differences in the adsorption energies between nearest adsorption sites yield the information about energy barriers for the diffusion of adatoms on the monolayer. The strongest adsorption energies and corresponding adsorption positions are listed in Table 5.1. In view of cluster-free adsorption of adatoms, the experimental cohesive energies ( $E_{coh}$ ) in the bulk phase were compared with the adsorption energies of adatoms on the stanene monolayer [120]. In most cases, the adsorption energies are stronger enough to ensure a uniform distribution of adatoms on the stanene sheet, which further ensure that atoms can form 2D layers on stanene surface. The detailed description of migration energies of all the adatoms is provided in Paper IV. Here, we discuss the selective cases from different groups of atoms.

All the AM atoms (Li, Na, K) behave alike and prefer the H site for adsorption. B site acts as a non-stable (transition state) adsorption site and the adatom moves to the nearest V site. Similarly, T site is the least favorable for adsorption of AM adatoms. Conversely, AEM atoms (Be, Mg, Ca) differently interact with stanene monolayer, for example, Mg and Ca prefer to get adsorbed at H site, unlike Be atom which strongly binds at V site with a adsorption energy of 3.152 eV. TM atoms strongly interact with stanene monolayer as compared to other group IV monolayers.



*Figure 5.1.* The adsorption energies of (a) Metals (Li, Be, Mg, and Ti), (b) Group III-VII elements (B, S, N, and F) for different possible adsorption sites.

**Table 5.1.** For each atom on stanene monolayer, most stable adsorption sites (B, H, T, and V indicating bridge, hollow, top, and valley sites, respectively), the adsorption energies (eV),  $E_{ads}/E_{coh}$ , and structural distortion  $\delta_{Sn}$  (10<sup>-1</sup> Å) are listed.

Adatom	Adsorption site	Adsorption energy (eV)	Eads/Ecoh	Distortion $\delta_{Sn}$ (10 <sup>-1</sup> Å)
Li	Н	-3.220	1.98	0.0
Na	Н	-2.643	2.37	0.2
K	Н	-2.694	2.88	0.4
Be	V	-3.152	0.94	0.2
Mg	Н	-1.756	1.16	0.2
Ca	Н	-3.351	1.82	0.2
Sc	Н	-4.938	1.27	0.0
Ti	Н	-5.277	1.09	0.1
V	Н	-4.214	0.79	0.1
Cr	Н	-3.019	0.73	0.0
Mn	Н	-3.075	1.05	0.0
Fe	Н	-3.759	0.88	0.2
Co	V	-4.281	0.97	0.2
Ni	V	-4.839	1.09	0.2
Cu	Н	-3.282	0.94	0.0
Zn	V	-1.162	0.86	0.1
В	V	-5.410	0.93	0.3
Al	В	-3.390	1.0	0.1
Ga	Н	-3.240	1.15	0.3
N	V	-4.120	0.84	0.3
P	V	-3.670	1.08	0.0
As	T	-3.680	1.24	0.3
0	В	-5.700	2.19	0.0
S	В	-4.270	1.49	0.2
Se	В	-3.850	1.56	0.2
F	T	-4.880	0.84	0.0
Cl	T	-3.490	2.49	0.1
Br	T	-3.060	2.51	0.3

H site is preferred by most of the TM atoms in minimum energy configuration except Ni, Co, and Zn, whereas B is the transition site for all the TM atoms except Zn. Compared to all the TM atoms, the strongest interaction with stanene monolayer is noted for Ti which also experiences a high migration energy barrier between different adsorption sites. Group IIIA elements, B, Al, and Ga show distinct adsorption trends on stanene, as B atom prefers V site, whereas Al and Ga prefer B and H sites for adsorption, respectively. Group IVA elements (C, Si, Ge, and Sn) adsorb on the stanene monolayer and lead to structural instability, as confirmed by MD simulations at the temperature of 150 K. Group (V-VI)A elements strongly bind on stanene monolayer (with  $E_{ads}/E_{coh} > 1$ ) in most cases. Similarly, halogens Cl and Br strongly interact with the sheet and F exhibits weaker interaction, as indicated by  $E_{ads}/E_{coh}$  ratios for each of these atoms. In Figure 5.1(a-b), the adsorption energies against the

adsorption site are plotted for selective atoms from different groups of the periodic table.

#### 5.1.2 Structural Deformations

The adsorption of adatoms leads to different structural changes in the stanene monolayers, for example, Be atom propels the Sn atom at V site and substitutes it. Mg atom adsorbs on the V site forming a dumbbell type structure by slightly repelling Sn atom out of the sheet.

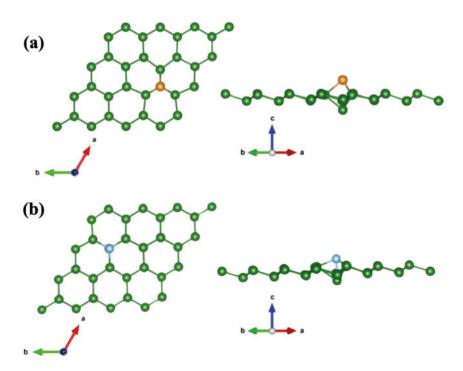


Figure 5.2. Structural changes in stanene monolayer due to (a) Mg, and (b) Ti atom adsorption.

Similarly, all the TM atoms placed at V site repel Sn atoms out of the sheet and form dumbbell structures. We quantified the structural distortion  $\delta_{Sn}$  by computing the change in z-coordinate of the Sn atoms before and after adatom adsorption. Due to the higher structural stability, only small distortions (<0.05 Å) are observed for each case, as listed in Table 5.1. In Figure 5.2, Mg and Ti adsorption on the stanene monolayer on V site is shown where structural distortion and formation of dumbbell structure are apparent.

### 5.1.3 Electronic Structure and Charge Analysis

The adsorption of adatoms on the stanene surface is further accompanied by charge redistributions between the adatoms and the monolayers. Each atom interacts with the monolayer via charge donation or acceptance based on the electronegativity of dopant with respect to Sn atoms in stanene monolayer. For the cases when electronegativity of adatom is lower than Sn, the charge transfer takes place from adatom to the sheet, e.g., AM, AEM, and TM atoms except for Ni, Co, and Cu. Similarly, higher electronegativities of adatoms cause the transfer of charges from sheet to adatom, e.g., O, F, and Cl.

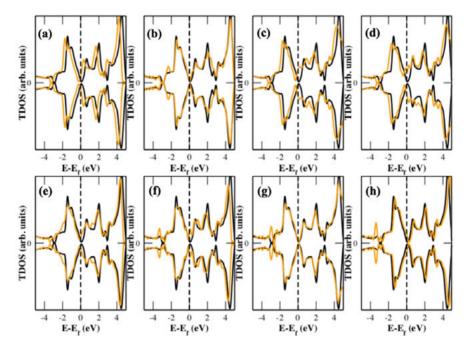


Figure 5.3. TDOS for pristine (black) and doped stanene (orange) sheets with (a) Li, (b) Be, (c) Sc, (d) Ti, (e) B, (f) N, (g) O, and (h) F atoms.

The interaction of adatoms further affects the electronic structure of the stanene sheets. The black and orange lines in the plots indicate TDOS for pristine and doped stanene sheets. The TDOS of stanene sheets with and without adsorbed adatoms (Li, Be, Sc, Ti, B, N, O, and F, respectively) are plotted in Figure 5.3(a-h) where the broadening and shifting of the electronic states are visible close to the Fermi level.

Part III: Final Remarks

# 6 Summary and Outlook

The rate of worldwide fossil fuel consumption is alarmingly high which points towards the possible energy crisis in the near future. Besides the sharp decay of fossil reserves, the combustion of hydrocarbons is associated with the emission of hazardous gases in the environment. Global warming caused by the emission of CO<sub>2</sub> and other greenhouse gases does not only call for sustainable, economical, and environmentally benign harvesting of energy but also demands the development of efficient gas sensors or capturers. In this thesis work, low-dimensional materials are designed and investigated for their applications in the field of clean energy harvesting and gas sensing. We used van der Waals (vdW) corrected density functional theory (DFT) to compute and modify the properties of the materials at the atomic scale for applications in the aforementioned fields.

The detailed theoretical background of DFT along with computational methods is presented in *Chapter 2*. The interaction of molecules with nanostructures is typically administered by long-range forces that aren't contained in the Kohn-Sham (KS) DFT. Therefore, vdW correction terms are deliberately included in the DFT computations for an accurate depiction of the total free energy of the system and other material properties.

In *Chapter 3*, the strategies of materials-based hydrogen (H<sub>2</sub>) storage are discussed along with the challenges and limitations of chemisorption and physisorption techniques. H<sub>2</sub> is an ideal carrier of energy due to its high energy content and abundance in nature. Being an environment friendly, economical and sustainable energy carrier, H<sub>2</sub> is capable to completely replace fossil fuels for energy applications. However, the gaseous nature and low volume density of H<sub>2</sub> makes it difficult to store for practical applications. Conventional ways for storing H<sub>2</sub>, liquefaction and pressurized hydrogen, are considered unsafe and economically impracticable.

Chemical storage of atomic hydrogen in solid-state materials, such as metal hydrides, is glimpsed as a viable solution for  $H_2$  storage, however, the inadequate adsorption energies and unfavorable adsorption/desorption kinetics hinder the reversibility and practicability of the storage medium. The physical adsorption of  $H_2$  on the surfaces of nanostructures offers faster kinetics, reversibility, and economic viability but the strength of  $H_2$  adsorption and storage capacity of the medium needs further improvements. Ideally, these systems should be capable to bind  $H_2$  with adsorption energies in the range of

0.2-0.6 eV and practical gravimetric capacities of > 5 wt%. Hereby, we modeled and explored the low-dimensional nanostructures for enhanced H<sub>2</sub> uptake. In this context, the strategies of metal doping and molecular functionalization were considered. The decoration of light metal adatoms on nanosheets, graphdiyne (GDY), siligraphene (SiC<sub>7</sub>), boron carbide (BC<sub>3</sub>), and boron phosphide (BP) sheets could enhance the strength of the interaction between H<sub>2</sub> and the host, therefore, the adsorption energies in most cases were ultimate for practical implementations in the fuel cell. Each metal center could hold multiple H<sub>2</sub> leading to reasonably high gravimetric capacities of the storage system. The high storage capacity was further facilitated by the large surfaceto-volume ratio of the nanostructures. Similar to atomic doping, the storage capacity and interaction of H<sub>2</sub> could be enhanced by molecular functionalization. For instance, h-BN sheets functionalized with OLi and ONa, and carbon nanotubes (CNTs) with polylithiated species could capture a large amount of H<sub>2</sub> with adequate strength of adsorption. Based on our DFT computations, we proposed that our functionalized nanosheets and CNTs are worth experimental exploration for H<sub>2</sub> storage.

In Chapter 4, the potential of 2D S-functionalized nitride MXenes ( $Ti_2NS_2$  and  $V_2NS_2$ ) and light metal functionalized boron carbide (BC<sub>3</sub>) sheets is studied for the sensing and capturing of various hazardous molecules. The adsorption of molecules on the nanosheets leads to a change in the electronic properties, geometry, and surface work function of the sheets. The computed adsorption energies of molecules on MXene sheets depicted that both  $Ti_2NS_2$  and  $V_2NS_2$  sheets could efficiently sense NO and  $NO_2$  molecules with intermediate adsorption strength, which is suitable for fast recovery of the nanosheets after gas sensing. MXene sheets were least sensitive to the carbon-containing gases CO,  $CO_2$ , and  $CH_4$ . On the contrary, we depicted higher sensitivity of metal-doped  $BC_3$  sheets for the aforementioned carbonaceous gases. From DFT computations, it is predicted that S-functionalized nitride MXenes and metallized  $BC_3$  sheets can serve as the efficient 2D gas sensors for particular gas molecules.

Subsequently, *Chapter 5* is dedicated to investigating the effect of foreign adatoms on the properties of 2D materials. The structural, electronic, and mechanical properties of 2D materials are greatly influenced due to the adsorption of adatoms, which serves as an important tool for materials design for various applications. In this regard, we studied the stanene monolayer with thirty-one different atoms belonging to different groups of the periodic table. Adsorption of adatoms leads to the structural deformations, charge redistributions, variation in the surface work function, and the electronic properties of the stanene monolayer, which were computed with the help of DFT computations.

In a nutshell, this thesis work is based on the DFT computations which serve as a guideline for the design of efficient  $H_2$  storage and gas sensing materials. The practical implementation of the  $H_2$  storage system can turn the

vision of the  $H_2$  economy into a reality that can consequently promise environmental sustainability. Meanwhile, the sensing and monitoring of harmful pollutants and controlling their concentration in the air play an important role for health and safety.

# 7 Svensk Sammanfattning

Den globala konsumtionen av fossila bränslen är oroväckande hög vilket pekar mot en eventuell energikris inom en snar framtid. Förutom den kraftiga minskningen av fossila reserver hör förbränningen av kolväten samman med utsläpp av miljöfarliga gaser. Den globala uppvärmningen som orsakas av utsläpp av koldioxid och andra växthusgaser kräver inte bara en hållbar, ekonomisk och miljövänlig energitillverkning utan också utveckling av effektiva gassensorer och infångare. I denna avhandling designas och undersöks lågdimensionella material för tillämpningar inom grön energitillverkning och gassensorer. Vi har använt oss av van der Waals (vdW) densitetsfunktionsteori (DFT) för att beräkna och modifiera egenskaper hos material på atomnivå för tillämpningar inom ovan nämnda områden.

Den detaljerade teoretisk bakgrunden för DFT tillsammans med beräkningsmetoder presenteras i kapitel 2. Interaktionen mellan molekyler och nanostrukturer styrs vanligtvis av krafter med lång räckvidd som inte ingår i Kohn-Sham (KS) DFT. Därför har vdW-korrigeringsfaktorer inkluderats i DFT-beräkningarna för att ge en exakt bild av den totala fria energin i systemen och andra materialegenskaper.

I kapitel 3 diskuteras strategier för materialbaserad vätgaslagring  $(H_2)$  tillsammans med utmaningar och begränsningar för kemisorption och fysisorptionstekniker.  $H_2$  är en idealisk energibärare på grund av sitt höga energiinnehåll och sin rikliga naturliga förekomst. Som en miljövänlig, ekonomisk och hållbar energibärare har  $H_2$  möjlighet att helt ersätta fossila bränslen i energitillämpningar. Dock är  $H_2$  svår att lagra för praktiska tillämpningar på grund av att den i normaltillståndet existerar i gasfas och har en låg volymdensiteten. Konventionella sätt att lagra  $H_2$ , via förvätskning och komprimering, anses vara osäkra och ekonomiskt olönsamma.

Kemisk lagring av väte i fasta material, såsom metallhydrider, förefaller vara en genomförbar lösning för  $H_2$ -lagring, men otillräcklig adsorptionsenergi och ogynnsam adsorption/desorptions-kinetik försämrar reversibiliteten och dess praktiska användbarhet. Den fysiska adsorptionen av  $H_2$  på ytorna av nanostrukturer erbjuder snabbare kinetik, reversibilitet och ekonomisk lönsamhet, men styrkan på  $H_2$ -adsorptionen och lagringskapaciteten hos mediet behöver förbättras ytterligare. I bästa fall borde dessa system kunna binda  $H_2$  med en adsorptionsenergi i intervallet 0,2-0,6 eV och en praktiska gravimetrisk kapacitet på >5 viktprocent. Därför modellerade och undersökte vi lågdimensionella nanostrukturer för ett förbättrat  $H_2$ -upptag. I denna kontext

övervägdes metoderna metalldoping och molekylär funktionalisering. Dekorationen av lätta metalladatomer på nanoskikt, grafdiyn (GDY), siligrafen (SiC<sub>7</sub>), borkarbid (BC<sub>3</sub>) och borfosfid (BP)-skikt, kunde öka styrkan i interaktionen mellan H<sub>2</sub> och värdmaterialet, och genom detta var adsorptionsenergierna i de flesta fall helt ändamålsenliga för praktisk tillämpning i bränsleceller. Varje metallcenter kunde hålla flera H<sub>2</sub> vilket gav tillräckligt hög gravimetrisk kapacitet hos systemen. Den höga lagringskapaciteten underlättades ytterligare genom nanostrukturernas stora yta-till-volymförhållande. Liksom vid atomdoping kunde lagringskapaciteten och interaktionen av H<sub>2</sub> förbättras genom molekylär funktionalisering. Exempelvis kunde h-BN-skikt som funktionaliserats med OLi och ONa, och kolnanorör (CNT) med polylitierade ämnen, fånga stora mängder H<sub>2</sub> med tillräcklig adsorptionsstyrka. Med utgångspunkt i våra DFT-beräkningar föreslog vi att våra funktionaliserade nanoskikt och CNT:er är värda att undersöka experimentellt för vätgaslagring.

I kapitel 4 studeras 2D S-funktionaliserade nitrid- MXener ( $Ti_2NS_2$  och  $V_2NS_2$ ) och lättmetallfunktionaliserade borkarbidskikt ( $BC_3$ ) med avseende på deras potential för att känna av och fånga in olika skadliga molekyler. Adsorptionen av molekyler på nanoskikten leder till förändringar i skiktens elektroniska egenskaper, geometri och arbetsfunktion. De beräknade adsorptionsenergierna för molekyler på MXene-skikten visar att både  $Ti_2NS_2$ - och  $V_2NS_2$ -skikt effektivt kunde känna av NO- och  $NO_2$ -molekyler med mellanliggande bindningsstyrka, vilket är lämpligt för snabb återhämtning av nanoskikten efter gasavkänning. MXene-skikten var minst känsliga för de kolhaltiga gaserna CO,  $CO_2$  och  $CH_4$ . Å andra sidan påvisade vi högre känslighet hos metalldopade  $BC_3$ -skikt för de kolhaltiga gaserna. Från DFT-beräkningar framgår att S-funktionaliserade nitrid- MXener och metalliserade  $BC_3$ -skikt bör kunna fungera som effektiva 2D-gassensorer för specifika gasmolekyler.

Därefter ägnas kapitel 5 åt att undersöka effekten av främmande adatomer på 2D-materialens egenskaper. De strukturella, elektroniska och mekaniska egenskaperna hos 2D-material påverkas i hög grad av adsorptionen av adatomer, något som utgör ett viktigt verktyg vid materialdesign för olika tillämpningar. På detta sätt studerade vi stanene monolager med trettioett olika atomer tillhörande olika grupper i det periodiska systemet. Adsorption av adatomer leder till strukturella deformationer, laddningsomfördelningar, variationer i ytans arbetsfunktion och i de elektroniska egenskaperna för stanen monolagren, vilket beräknades med hjälp av DFT-beräkningar.

Sammanfattningsvis är denna avhandling baserad på DFT-beräkningar vilka fungerar som guider för utformningen av effektiva  $H_2$ -lagrings- och gassensor-material. Den praktiska tillämpningen av  $H_2$ -lagringssystem kan förvandla visionen om  $H_2$ -ekonomin till en verklighet som följaktligen kan lova miljömässig hållbarhet. På samma gång spelar avkänning och övervakning av skadliga föroreningar och kontroll av deras koncentration i luften en viktig roll för hälsan och säkerheten.

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