

# Simulating Raman spectra: A CP2K-based implementation and its application to defective graphene nanoribbons

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## Abstract

During recent years, the Swiss Federal Laboratories for Materials Science and Technology (Empa) have successfully been fabricating increasingly complex atomically precise graphene nanoribbons (GNRs). An important aspect in the fabrication and characterization of carbon based nanomaterials such as GNRs is the comparison between measured and predicted spectroscopy and microscopy features key to the identification of so-called fingerprints of the fabricated nanostructures. Raman spectroscopy, which is based on a specific type of photon scattering, is a commonly used method to obtain such fingerprints. Currently, no straightforward out-of-the-box tool to predict Raman characteristics based on known molecular geometry exists.

My project uses the atomistic simulation software CP2K and Python-based numerical calculations based on density functional theory and the Placzek approximation to obtain Raman characteristics of a selection of graphene nanoribbons representative of the class of graphene nanoribbons fabricated at Empa. The goal of this endeavor is twofold: To estimate whether calculated Raman characteristics match experimental measurements, and to investigate whether the calculated Raman characteristics allow for the identification of and distinction between defects commonly occurring in the bottom-up fabrication of graphene nanoribbons as pioneered at Empa.

The obtained results indicate that while the calculated Raman characteristics come close to experimental observations, the match is not perfect. The chosen computational approach however seems very well suited to identifying and distinguishing fingerprints pertaining to common defects in graphene nanoribbons.

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# Introduction

## 1.1 | Background to the Study

During recent years, the Swiss Federal Laboratories for Materials Science and Technology (Empa) have successfully been fabricating increasingly complex atomically precise graphene nanoribbons (GNRs). Graphene nanoribbons are planar and finite graphene structures narrow enough they are considered quasi-one-dimensional and are colloquially best described as strips of graphene. An important aspect in the fabrication and characterization of carbon based nanomaterials such as GNRs is the comparison between measured and predicted spectroscopy and microscopy features key to the identification of so-called fingerprints of the fabricated nanostructures. Raman spectroscopy, which is based on a specific type of photon scattering, is a commonly used method to obtain such fingerprints. Currently, no straightforward out-of-the-box tool to predict Raman characteristics based on known molecular geometry exists.

## 1.2 | Aim, Scope, and Limitations

The aim of this study is to establish the feasibility and usefulness of implementing an efficient procedure to simulate Raman characteristics of carbon-based nanomaterials using quantum chemical calculations and numerical methods based on the Placzek approximation.

To this end, the study covers the calculation of Raman characteristics for the following three sample groups (in increasing order of sample molecule complexity):

- A proof of concept for a non-graphene small organic molecule to verify the method.

- Analysis of two small-to-medium-sized defect-free GNRs for which experimental measurements are available.
- Analysis of a medium-to-large-sized GNR both defect-free and with three common GNR defect types.

In terms of limitations, no attempt to separate specific aspects of the simulated Raman characteristics into contributions from different molecular vibrational modes is made.

Also, no calculations beyond the Placzek approximation are attempted.

Finally, all calculations are made in simulated vacuum and without taking any substrate into account.

## 1.3 | Overview of the Study

The first two chapters following this introduction establish the necessary background knowledge and definitions.

Chapter 2 looks at graphene nanoribbons and their properties and characterizations relevant to this study. Chapter 3 serves to explain both the relevant theory of Raman scattering and the salient computational considerations. Based on chapters 2 and 3, chapter 4 details the specific sample molecules assigned to this study and highlights the research question. Chapter 5 illustrates the computational workflow as the method designed to answer the research question. The results of the computations are presented in chapter 6 and discussed in chapter 7. Finally, concluding remarks are given in chapter 8.

# Graphene Nanoribbons

## 2.1 | Introduction

As laid out in the introduction, this study deals with the analysis and simulation of Raman characteristics as a way of fingerprinting graphene nanoribbons (GNRs)

To do so, the current chapter's aim is to establish the definition of graphene nanoribbons as a specific form of carbon based nanostructure and sets the scene for a more detailed explanation of the methods and techniques used later on.

To explain the peculiar physical properties of carbon nanostructures, analysis and characterization of their atomic structure is required. Due to the size scale, experimental analysis methods are not straightforward and often difficult to interpret. Computational methods are therefore useful to augment and extend experimental insights while being efficient in both cost and time.

After introducing and defining graphene nanoribbons, their most salient properties are listed. We then present an overview of current routes towards synthesizing graphene nanoribbons and finish with a look at both experimental and computational characterization methods.

## 2.2 | Historical Perspective and Terminology

Graphene nanoribbons (GNRs) are a specific type of graphene, a crystalline carbon allotrope in the form of a single-layered hexagonal lattice with carbon atoms at each vertex. Graphene per se has a rich potential of possible applications in engineering and science (Geim and Novoselov, 2007). GNRs in specific have started to attract increased research interest (Fujita et al., 1996) about a decade after the discovery of fullerene

molecules (Kroto et al., 1985) invigorated interest in nanoscale carbon structures. Initially used mainly as a convenient theoretical model in the 1990s (Fujita et al., 1996; Klein, 1994; Nakada et al., 1996), a decade later experiments demonstrated the semiconducting properties of GNRs (Novoselov et al., 2004), paving the way towards possible applications in digital electronics. The descriptive term *ribbon* in GNRs stems from the fact that GNRs are not infinite two-dimensional like a graphene layer, but instead are strips of graphene finite both in length and width with an aspect ratio such that they effectively can be considered one-dimensional systems. According to present day conventions, GNRs are generally less than 100nm wide and often are fabricated to measure only between 5nm and 50nm wide (Nakada et al., 1996; Talirz and Pignedoli, 2020).

A deciding characteristic of GNRs is their peripheral shape or edge structure. This shape stems directly from the direction along which a raw sheet of graphene would have to be cut to obtain the ribbon under consideration. The two possible higher-order structures topologically mandated by the characteristics of the one-layer graphene carbon lattice are designated *armchair* and *zigzag* (Fujita et al., 1996). Figure 2.1 shows sample ribbons of the armchair (AGNR, red) and the zigzag (ZGNR, black) type. Here, blue marks *chiral* ribbons, a third designation given to those ribbons which originate from cutting a graphene sheet in an intermediate direction (Talirz and Pignedoli, 2020).

The width of ANGRs is given as  $N_A$ , the number of carbon dimers across the ribbon at the wider sections including the edges. Consequently, the width of ZGNRs is given as  $N_Z$ , the number of zigzag lines formed by the carbon atoms when viewed along the ribbons, also including the edges (see figure 2.1 for both). There is no further commonly accepted terminology for GNRs. Especially notable is the absence of any naming convention for decorating the carbon atoms sitting at the edges with other chemical species. Where not stated otherwise, it is standard practice to implicitly assume open bond deactivation by hydrogen atoms.

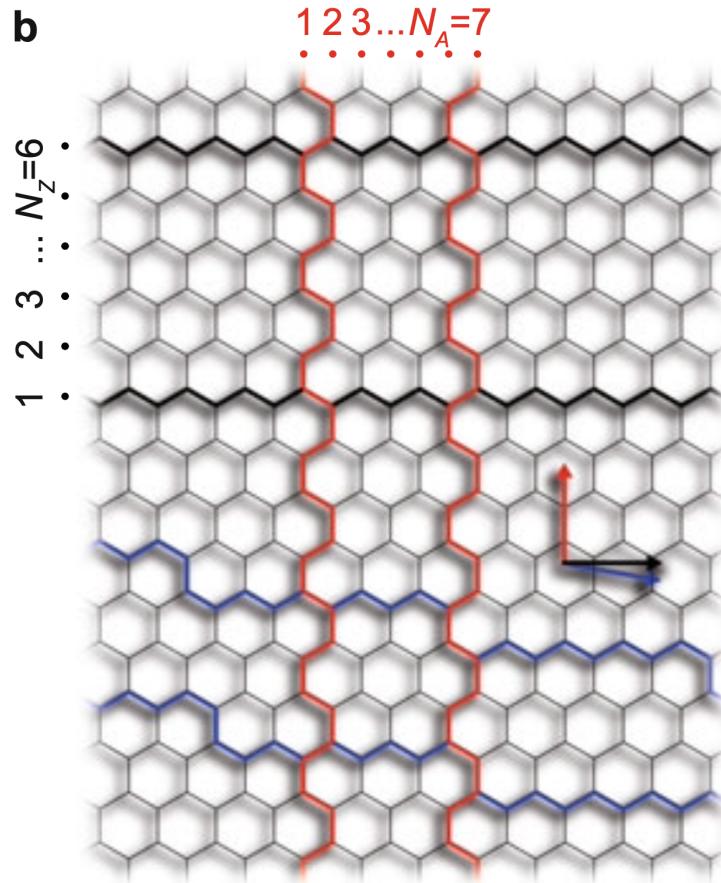


Figure 2.1: GNRs with armchair (red), zigzag (black), and chiral (blue) edges, shown on graphene sheet (Talirz and Pignedoli, 2020).

## 2.3 | Properties and Synthesis of GNRs

In general, all physical properties of GNRs strongly depend on their edge structure as introduced above as well as on their atomic precision or structural perfection. Structural perfection in this context signifies absence of any defects in terms of conformation or doping purity. While the majority of current interest in GNRs is rooted in their electronic properties as already hinted at above, their mechanical and optical properties also warrant interest. At the nanometer scale, direct testing of deformation under mechanical strain currently is out of experimental reach, but simulation methods predict an extremely high Young's modulus (Bu et al., 2009). Again, mechanical properties seem to depend on the specific geometry of GNR samples. The optical properties of GNRs again differ depending on geometry as manifested in different selection rules for opti-

cal transitions (Lin and Shyu, 2000).

Graphene in itself has attracted enormous attention for electronic applications (Cheng et al., 2012), but its lack of a bandgap limits its potential for general purpose transistors (Schwierz, 2013). However, cutting graphene into GNRs offers a way to create a bandgap via quantum confinement while maintaining graphene's other positive electronic properties (Barone et al., 2006; Talirz and Pignedoli, 2020). Rule-of-thumb calculations show that the minimum bandgap of 0.4 eV required for a transistor on/off ratio in the  $10^4 - 10^6$  range as required for digital logic circuits (Kim et al., 2011) can only be obtained by making AGNRs no more than a few nanometers equivalent to about 50 carbon atoms wide (Berger et al., 2006).

Naturally, fabricating structures of such small dimensions and thus highly sensitive to irregularities in their edge structure and purity for the use in experiments or demonstrator devices is a daunting task. The different routes towards the production of GNRs explored in recent years can be sorted into several major groups: Chemical vapor deposition was first to be implemented (Murayama and Maeda, 1990) and followed by what could be summarized as chemical (Affoune et al., 2001), lithographic (Chen et al., 2007), unzipping (Cano-Márquez et al., 2009), and bottom-up synthesis (Cai et al., 2010) methods.

The most precise and thus most promising results to date have been obtained by a bottom-up approach combining two of the earlier techniques: Molecular precursors designed to obtain a desired electronic structure as determined by GNR width, edge structure, and edge passivation are synthesized in solution. These precursors are then evaporated onto a crystalline noble metal surface. With their docking sites such activated, the precursors diffuse and polymerize onto the noble metal surface. After additional carbon bond formation is achieved at an elevated temperature, the formed GNRs then ideally uniformly conform to the electronic properties brought about by their design geometry (see figure 2.2).

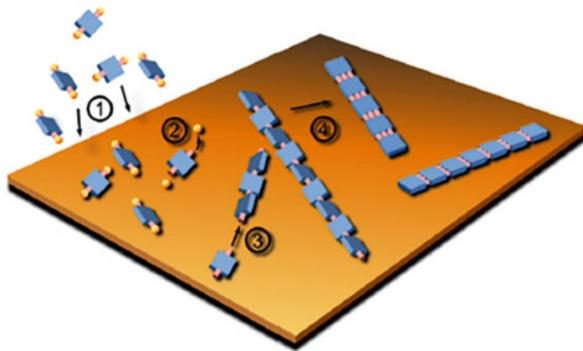


Figure 2.2: Deposition of the molecular precursors (1) onto a crystalline noble metal surface at temperature  $T = T_1$  activates their docking sites (2) by removing the halogen atoms. The activated radicals diffuse across the surface and polymerize (3). At elevated temperature  $T_2 > T_1$ , additional chemical bonds form (4), yielding the planar GNRs (Cai et al., 2010; Talirz and Pignedoli, 2020).

## 2.4 | Analysis and Characterization of GNRs

Common to all forms of GNRs no matter what the synthesis method or the exact geometry is the requirement for analysis and characterization. The reasons are twofold: Firstly, defects are very much relevant for the properties of nanostructures and thus need to be discovered and quantified; and secondly, only the study especially of the electronic structure of GNRs allows predictions on their mechanical, optical and electronic properties. The characterization techniques employed in the analysis of GNRs on substrates so far belong into two major groups: Spectroscopy methods such as Raman spectroscopy (Malard et al., 2009) and infrared spectroscopy (Sasaki et al., 2018) as well as scanning probe microscopy methods such as scanning tunneling microscopy (Lahiri et al., 2010). While scanning probe microscopy methods offer precise imaging of the atomic structure as well as characterization of the electronic properties, they are elaborate in terms of equipment and procedures and are generally only applied to small samples. Raman and infrared spectroscopy on the other hand are well suited to the quick analysis of larger samples with regard to the presence of defects and geometric properties such as average GNR length. Infrared spectroscopy being a fairly recent technique in this context, Raman spectroscopy is currently the most ubiquitously used method for the characterization of GNR samples on a substrate.

## 2.5 | Computational Methods

To complement and verify GNR data obtained by the experimental characterization methods described above, computational methods are employed to calculate GNR properties based on their molecular structure. These methods mostly revolve around either microscopic, that is quantum mechanical, calculations using density functional theory (Baroni et al., 2001) but also include classical macroscopic molecular dynamics (Neek-Amal and Peeters, 2010) and, for the investigation of the mechanical rather than electronic properties of GNRs, even finite element methods (Georgantzinos et al., 2011).

In broad terms, the aim of these computational methods is to first establish a sample molecule's total energy in relation to the molecule's specific geometric and electronic configuration. Then, depending on the quantity of interest, the changes in the molecule's total energy when subjected to change-of-energy-inducing stimulation of an electronic or mechanical nature are quantified.

## 2.6 | Conclusion

Having established GNRs as a structure of interest with several interesting properties, we are now well aware of the necessity of analysis and characterization. Raman spectroscopy as the most widely used and documented method of choice is well suited to analyze the most recent bottom-up synthetization methods as developed at Empa. Also, Raman spectroscopy is ideally complemented by computational methods to verify and predict experimental measurements.

# Raman Spectroscopy

## 3.1 | Introduction

As Raman spectroscopy is the most versatile and abundantly used way of characterizing materials including GNRs, its experimental aspects need to be understood. As it is desirable especially for reasons of cost and efficiency to be able to compute Raman characteristics in addition to experimental measurements, the computation of Raman characteristics is just as relevant.

This chapter looks at the setup and geometry of Raman spectroscopy experiments and then mirrors those considerations from a computational perspective resulting in a sample comparison between experimentally measured and computed Raman characteristics.

After a short historical review and a minimum amount of definitions, we take a look at the geometry and coordinate system as well as the parameters of a common experimental setup. Moving on to the computational aspects, computation of the Raman tensor including the rotational invariants derived from said tensor is introduced. Finally, a chain of simplifications leads to an expression enabling the comprehensive comparison of different sample molecules with regards to their Raman scattering behavior.

## 3.2 | Historical Perspective and Basics

Scattering of light with change of frequency was discovered by C. V. Raman in 1928 (Raman and Krishnan, 1928) when examining the scattering of focused light in vapors and liquids. Raman's discovery followed the preceding theory on scattering of light without change of frequency, also called elastic scattering, as formulated by Rayleigh in 1871. Consequently, as it involves a change of frequency, Raman scattering is often called inelastic scattering (see figure 3.1 for both). Further theoretical predictions on Raman scattering processes were made soon after Raman's discovery, for example by Placzek (Placzek, 1934), but the fact that spontaneous Raman scattering is several orders of magnitude less common than Rayleigh scattering made experimental measurements difficult. Only the availability of working laser devices several decades later allowed extended experiments involving large numbers of finely frequency-tuned photons. In Raman spectroscopy, incident monochromatic photons generated by a laser and thus with a precisely tuned frequency interact with the sample matter's structure: Described conceptually, the incoming photon gets annihilated, resulting in two effects: A perturbation-induced transition of the sample molecule to a different energy state and the creation and scattering of a new photon with a different frequency. First considering the effect on the sample molecule, the change of energy state translates into a change of molecular vibrational energy realized by the sample molecule switching to a different vibrational mode. Using a quantum mechanical approach, vibrations of the molecular lattice can be quantized. A quantum of vibration is called a phonon, a virtual particle, with the total vibrational energy of a molecule being equal to the sum of all individual phonons' energies. Considering on the other hand the newly created scattered photon, conservation of energy dictates that this photon ends up with an frequency matching the change of energy of the sample molecule it originates from. Overall, there are two principal cases: If the energy of the sample molecule is increased during the process and the molecule is excited to a higher vibrational mode, the scattered photon carries a lower frequency, corresponding to a lower energy, than the incident photon. Such a shift in frequency is called a Stokes shift in analogy to Stokes' law statement on the frequency of fluorescent light when compared to the excitation frequency. Conversely, if the sample molecule ends up in a lower vibrational energy state, this comes with an increase in frequency, and thus energy, of the scattered photon with regard to the incident photon and is called an Anti-Stokes shift. Taken together and their intensity recorded all over the spectrum, these Raman shifts in frequency of scattered incoming phonons constitute a Raman spectrum. The Raman spectrum can thus serve as a fingerprint of the molecu-

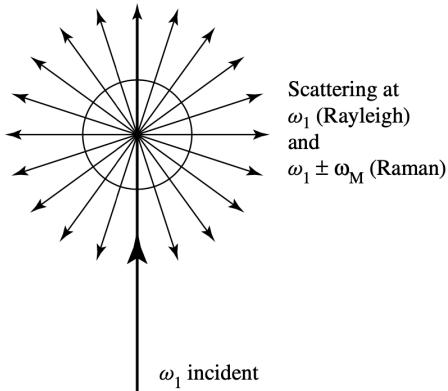


Figure 3.1: Diagrammatic representation of Rayleigh and Raman scattering (Long, 2002).

lar structure of a material sample system as manifested by its vibrational modes, which makes the Raman spectrum well suited to identify sample constituents and defects.

### 3.3 | Raman Spectroscopy Experiments

When considering actual experimental setups for Raman spectroscopy, the geometry describing incident illumination and scattering observation needs to be defined. While in principle any laboratory or fixed in space coordinate reference system can be used, it is most convenient and acceptable without loss of generality to choose a coordinate system simplifying most geometrical expressions. The commonly adapted choice thus is a space-fixed right-handed cartesian coordinate system in which the sample material is placed at the origin. The positive  $z$  axis is aligned with the incident photon radiation, while the  $x - z$  plane is aligned with the scattered photons traveling along an observation vector  $w$  at an observation angle  $\theta$  from the positive  $z$  axis (see figure 3.2). Commonly used observation angles are  $\theta = 0$  for forward scattering,  $\theta = \frac{\pi}{2}$  for  $90^\circ$  scattering and  $\theta = \pi$  for retro (or back) scattering, all of them further simplifying geometrical considerations. The incident radiation is typically set to be polarized with the electric vector parallel to the  $y$  axis and thus perpendicular to the  $x - z$  scatter plane. It is a simplifying idealization that also the scattered photons form a narrow beam fixed in diameter just like the incident laser radiation instead of radiating in all directions, but experimental setups can be arranged to closely approximate this assumptions. Furthermore, it can be shown (Long, 2002) that for this experimental setup, deviating from this ideal assumption of the scattered beam does not change the calculated intensities of the scattered radiation when considering isotropic scattering.

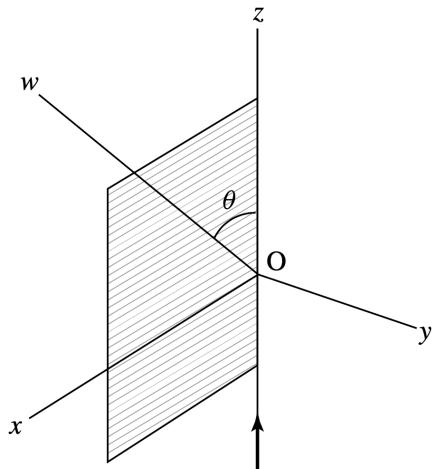


Figure 3.2: Commonly adapted illumination-observation geometry: Incident radiation aligned with positive  $z$  axis, sample at coordinate origin, scattered radiation aligned with  $w$  vector (Long, 2002).

Also, the specific choice of coordinate system ends up having no influence on the final Raman intensities: Considering the isotropic average over all possible orientations in space of the sample molecules makes intensity expression agnostic of the choice of coordinate system. The remaining experimental parameters are the frequency  $\omega_L$  and hence the wavelength  $\lambda_L$  of the incident laser radiation as well as the temperature  $T$  at which the experiment is conducted. The laser wavelengths most widely used in experiment are 532nm, 785nm and 1064nm. A temperature of 300K is generally adopted for Raman spectroscopy experiments.

## 3.4 | Raman Spectroscopy Computations

The first step towards calculating Raman spectra based on the known or assumed structure of a molecule is the relaxation of the molecule conformation into a minimum energy state through geometry optimization.

Having done that, there are several routes to obtaining the vibrational normal modes of the molecule which are required for calculating Raman spectra. In the simplest case, the potential energy surface is assumed to behave like a harmonic potential around the energetic minimum. The vibrational frequencies are then directly deduced from the second derivatives of the potential energy with regard to individual atomic displacements. A more sophisticated approach to obtain Raman spectra which includes quantum me-

chanical considerations and is especially suitable for solvation or bulk model samples is ab initio molecular dynamics (AIMD) (Luber et al., 2014; Thomas et al., 2013). Finally, a most generic approach to obtain lattice properties is ab initio quantum mechanical calculations using density functional (perturbation) theory (Baroni et al., 2001; Porezag and Pederson, 1996).

Following the basic approach laid out by the above established methods (Porezag and Pederson, 1996), we first calculate the sample molecule's vibrational eigenmodes in the harmonic approximation based on the potential energy surface obtained by density functional theory. Having obtained the molecule's vibrational normal modes and, as a function of the molecular vibrational frequencies, polarizability tensor  $\epsilon$ , the Raman tensor  $\alpha$  can be calculated (Liang et al., 2019; Porezag and Pederson, 1996) as given in equation 3.1.

$$\alpha_{i\beta\gamma} = \frac{\sqrt{\Omega}}{4\pi} \sum_{ni\gamma} \frac{\partial\epsilon_{\beta\gamma}}{\partial u_{inv}} e_{inv} \frac{1}{\sqrt{m_n}} \quad (3.1)$$

Here,  $\frac{\partial\epsilon_{\beta\gamma}}{\partial u_{inv}}$  is obtained as the finite difference derivative of the polarizability tensor  $\epsilon_{\beta\gamma}$  with respect to an atom-specific displacement  $u_{inv}$  along the direction  $\nu$  for normal mode  $i$  and atom  $n$ .  $e_{inv}$  is the corresponding eigenvector of the dynamical matrix, while  $m_n$  is the mass of the respective atom. Finally,  $\beta$  and  $\gamma$  are placeholders for the spatial coordinates  $x, y, z$ .

Having obtained the Raman tensor, the three Placzek rotation invariants (Placzek, 1934) are formed:  $G_{i,0}$  (equation 3.2) represents the mean polarizability of mode  $i$  while  $G_{i,1}$  (equation 3.3) stands for the respective antisymmetric anisotropy and  $G_{i,2}$  (equation 3.4) represents the corresponding anisotropy. In literature, these rotation invariants are more commonly but interchangeably expressed as  $a_i^2 = \frac{1}{3}G_{i,0}$ ,  $\delta_i^2 = \frac{3}{2}G_{i,1}$  and  $\gamma_i^2 = \frac{3}{2}G_{i,2}$ .

$$G_{i,0} = \frac{1}{3}(\alpha_{ixx} + \alpha_{iyy} + \alpha_{izz})^2 \quad (3.2)$$

$$G_{i,1} = \frac{1}{2}[(\alpha_{ixy} - \alpha_{iyx})^2 + (\alpha_{ixz} - \alpha_{izx})^2 + (\alpha_{izy} - \alpha_{iyz})^2] \quad (3.3)$$

$$G_{i,2} = \frac{1}{2}[(\alpha_{ixy} + \alpha_{iyx})^2 + (\alpha_{ixz} + \alpha_{izx})^2 + (\alpha_{izy} + \alpha_{iyz})^2] \\ + \frac{1}{3}[(\alpha_{ixx} - \alpha_{iyy})^2 + (\alpha_{ixx} - \alpha_{izz})^2 + (\alpha_{izz} - \alpha_{iyy})^2] \quad (3.4)$$

Evidently, for a symmetric Raman tensor  $G_{i,1}$  reduces to  $G_{i,1} = 0$  while  $G_{i,2}$  simplifies to  $G_{i,2} = 2[\alpha_{ixy}^2 + \alpha_{iyx}^2 + \alpha_{izx}^2] + \frac{1}{3}[(\alpha_{ixx} - \alpha_{iyy})^2 + (\alpha_{ixx} - \alpha_{izz})^2 + (\alpha_{izz} - \alpha_{iyy})^2]$ .

For all observation angles  $\theta \in \{0, \frac{\pi}{2}, \pi\}$  commonly used in experiment and linearly polarized incident radiation with the electric vector perpendicular to the  $x - z$  plane as

	$f(\cdot)$			$g(\cdot)$		
	$a^2$	$\delta^2$	$\gamma^2$	$G_0$	$G_1$	$G_2$
$\theta = 0$						
$\perp^s$	45	0	4	10	0	4
$\parallel^s$	0	5	3	0	5	3
$\theta = \frac{\pi}{2}$						
$\perp^s$	45	0	4	10	0	4
$\parallel^s$	0	5	3	0	5	3
$\theta = \pi$						
$\perp^s$	45	0	4	10	0	4
$\parallel^s$	0	5	3	0	5	3

Table 3.1: Coefficients of linear combinations  $f, g$  of Placzek invariants.

described above and hereafter designated  $\perp^{\text{inci}}$ , a modular closed expression for the intensity of the scattered radiation for any given sample molecule vibrational mode can be derived (equation 3.5, (Long, 2002)). Herein, the polarization state of the scattered radiation is considered for the states perpendicular  $p^s = \perp^s$  and parallel  $p^s = \parallel^s$  to the scatter plane. Furthermore, we have  $k_{\tilde{v}} = \pi^2/\epsilon_0^2$  and  $N_{v^i}$  as the number of sample molecules in the initial vibrational state  $v^i$ .  $\tilde{v}_s = \tilde{v}_{\text{inci}} \pm |\tilde{v}_{v^f v^i}|$  is the wavenumber of the scattered radiation wherein  $\tilde{v}_{\text{inci}}$  is the wavenumber of the incident radiation and thus  $\tilde{v}_{\text{inci}} = \tilde{v}_L$  for the common experimental setup with an illuminating laser.  $|\tilde{v}_{v^f v^i}|$  is the magnitude of the wavenumber associated with the (Anti-)Stokes vibrational transition from  $v^i$  to  $v^f$  of the sample molecule. Most importantly,  $f$  and  $g$  respectively are linear combinations of the rotation invariants  $a, \delta, \gamma$  and  $G_0, G_1, G_2$  respectively (see table 3.1 for the coefficients of the linear combinations). The rotation invariants in turn are functions of the hyperparameter observation angle  $\theta$ . Finally,  $\mathcal{I} = \frac{1}{2}c_0\epsilon_0 E_y^2$  is the irradiance of the incident radiation.

$$\begin{aligned} I(\theta; p^s, \perp^{\text{inci}}) &= k_{\tilde{v}} N_{v^i} \tilde{v}_s^4 \left[ \frac{1}{45} f(a^2, \gamma^2, \delta^2; \theta) \right] \mathcal{I} \\ &= k_{\tilde{v}} N_{v^i} \tilde{v}_s^4 \left[ \frac{1}{30} g(G_0, G_1, G_2; \theta) \right] \mathcal{I} \end{aligned} \quad (3.5)$$

Using several steps, additional expressions for the differential scattering cross-sections  $\sigma'$  of the two polarizations can be obtained for each sample molecule vibrational mode  $i$  with frequency  $\omega_i$ . These expressions represent the rate at which energy is removed

from the incident beam (Weber and Merlin, 2011) and are not only simpler to handle, but by being independent of irradiance of the incident radiation also facilitate comparing the scattering intensity fingerprints of different sample molecules: Starting from the expression for intensity  $I$ , we recognize from table 3.1 containing the respective coefficients for the Placzek invariants that the intensity  $I$  is identical for all observation angles  $\theta \in \{0, \frac{\pi}{2}, \pi\}$ . Doing away with constant factors by division, inserting the Bose occupation factor  $n(v_i) + 1 = (1 - \exp \frac{-hc\tilde{v}_i}{k_B T})^{-1}$  standing in for  $N_{v_i}$  as the number of sample molecules, and finally using the relationship between intensity and irradiance  $\sigma' = \frac{d\sigma}{d\Omega} = \frac{I}{T}$ , we arrive at the desired expressions (equations 3.6 and 3.7) for the considered experimental setup. The only remaining parameters now are  $\tilde{v}_L$  for the laser wavenumber and  $T$  for the system temperature.

$$\begin{aligned}\sigma'_i(\perp^s) &\sim \frac{1}{1 - \exp \frac{-hc\tilde{v}_i}{k_B T}} \frac{(\tilde{v}_L - \tilde{v}_i)^4}{\tilde{v}_i} \frac{45a_i^2 + 4\gamma_i^2}{45} \\ &\sim \frac{1}{1 - \exp \frac{-hc\tilde{v}_i}{k_B T}} \frac{(\tilde{v}_L - \tilde{v}_i)^4}{\tilde{v}_i} \frac{10G_{i,0} + 4G_{i,2}}{30}\end{aligned}\quad (3.6)$$

$$\begin{aligned}\sigma'_i(\parallel^s) &\sim \frac{1}{1 - \exp \frac{-hc\tilde{v}_i}{k_B T}} \frac{(\tilde{v}_L - \tilde{v}_i)^4}{\tilde{v}_i} \frac{5\delta_i^2 + 3\gamma_i^2}{45} \\ &\sim \frac{1}{1 - \exp \frac{-hc\tilde{v}_i}{k_B T}} \frac{(\tilde{v}_L - \tilde{v}_i)^4}{\tilde{v}_i} \frac{5G_{i,1} + 3G_{i,2}}{30}\end{aligned}\quad (3.7)$$

The final desired expression for the omnidirectional scattering cross-section best suited for averaging over all possible sample molecule orientations (equation 3.8) is obtained by adding  $\sigma'_i(\perp^s)$  and  $\sigma'_i(\parallel^s)$  from equations 3.6 and 3.7.

$$\begin{aligned}\sigma'_i(\perp^s + \parallel^s) &\sim \frac{1}{1 - \exp \frac{-hc\tilde{v}_i}{k_B T}} \frac{(\tilde{v}_L - \tilde{v}_i)^4}{\tilde{v}_i} \frac{45a_i^2 + 5\delta_i^2 + 7\gamma_i^2}{45} \\ &\sim \frac{1}{1 - \exp \frac{-hc\tilde{v}_i}{k_B T}} \frac{(\tilde{v}_L - \tilde{v}_i)^4}{\tilde{v}_i} \frac{10G_{i,0} + 5G_{i,1} + 7G_{i,2}}{30}\end{aligned}\quad (3.8)$$

## 3.5 | Comparing Experiment and Computation

Figure 3.3 details a standard setup of a Raman experiment to measure intensities of scattered radiation with both parallel and perpendicular polarization.

Having obtained the vibrational modes' omnidirectional scattering cross-sections as derived above resulting in equation 3.8, we set the obtained maximum differential scattering cross-section over all vibrational modes  $i$  to an arbitrary fixed value. All other modes' cross-section values are scaled accordingly to facilitate comparison between different sample molecules and experiments. Finally, figure 3.4 shows a representative result of a basic sample comparison between experiment and computation for the Raman spectrum of Bromellite (BeO).

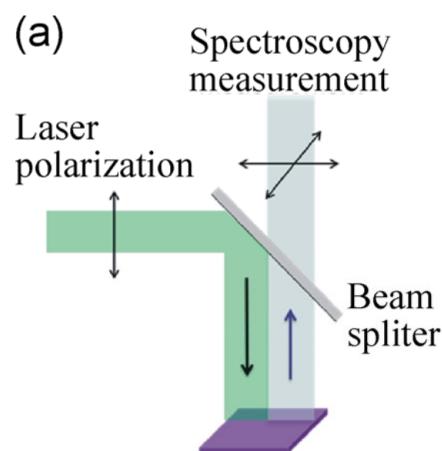


Figure 3.3: Setup of a typical Raman spectroscopy experiment (Deng et al., 2014).

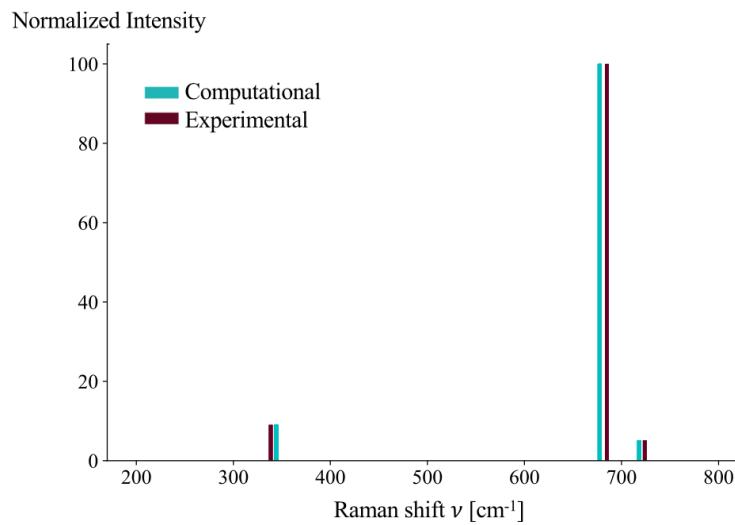


Figure 3.4: Comparison of experimental and computed Raman spectra of BeO (Long, 2002).

## 3.6 | Conclusion

Having established knowledge about the setup, geometry and parameters of Raman scattering experiments and having gone through the computational steps to obtain a normalized Raman spectrum for a given sample molecule, all necessary parts for conducting the computations assigned to this report are in place.

## Focus of Research

### 4.1 | Introduction

As shown so far, experimental and computational Raman spectroscopy is well suited to characterizing molecules. While widely applied to simple crystals (Ceriotti et al., 2006; Liang et al., 2019) and minerals (Lafuente et al., 2015), steps towards characterizing larger molecules have also been undertaken (Neugebauer et al., 2002; Reiher et al., 2003). It therefore is an obvious choice to use the introduced method to compute Raman spectra of GNR molecules representative of those synthesized at Empa and compare the spectra with each other and with experimental measurements where available.

To this end, we define a selection of test sample molecules.

### 4.2 | Research Question

The introduced method is used to calculate the Raman spectrum of three groups of sample molecules: A verification group consisting of a simple organic compound, a group of small-to-medium GNRs free of defects for which experimental spectra are available, and finally a group of medium-to-large GNRs with a focus on defects which commonly occur during synthetization by the bottom-up approach as pioneered at Empa (Pizzochero et al., 2020).

For the first and the second group where reference or experimental data are available, actual and computed Raman characteristics are plotted enabling direct comparison and assessment of the degree of similarity.

For the third group, calculated Raman characteristics are compared between the defect-free sample and the samples with disorders with the aim of identifying finger-

prints characteristic to the defects.

## 4.3 | Sample Molecules

### 4.3.1 | Verification Group with Reference Data

#### 4.3.1.1 | Ethane

Ethane (figure 4.1) is a hydrocarbon molecule with the chemical formula  $C_2H_6$  with a total count of 8 atoms and 7 bonds and a molecular mass of 30.069 g/mol. At standard pressure and temperature as encountered during the reference spectroscopy experiment, it is a colorless gas.

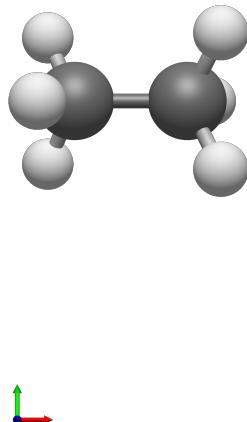


Figure 4.1: Ethane molecule.

### 4.3.2 | Small-to-medium GNRs Group with Experimental Data

#### 4.3.2.1 | Defect-free GNR: 7-AGNR (3 Units)

7-AGNR (3 units) (figure 4.2) is a GNR molecule whose edge structure is in armchair configuration. It has the chemical formula  $C_{42}H_{20}$  with a total count of 62 atoms and 74 bonds and a molecular mass of 524.619 g/mol. It consists of three connected units of three connected carbon rings spanning seven carbons atoms each.

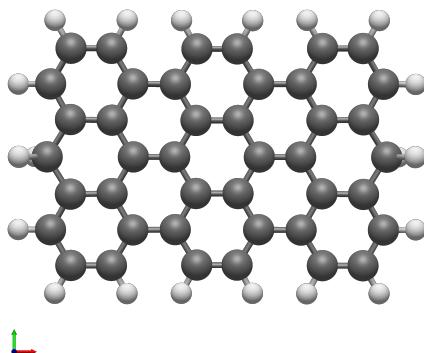


Figure 4.2: 7-AGNR (3 units) molecule.

#### 4.3.2.2 | Defect-free GNR: 7-AGNR (6 Units)

7-AGNR (6 units) (figure 4.3) is a GNR molecule whose edge structure is in armchair configuration. It has the chemical formula  $C_{84}H_{32}$  with a total count of 116 atoms and 143 bonds and a molecular mass of 1041.175 g/mol. It consists of six connected units of three connected carbon rings spanning seven carbons atoms each.

### 4.3.3 | Medium-to-large GNRs Group including Common Defects

#### 4.3.3.1 | Defect-free GNR: 7-AGNR (12 Units)

7-AGNR (12 units) (figure 4.4) is a GNR molecule whose edge structure is in armchair configuration. It has the chemical formula  $C_{168}H_{56}$  with a total count of 224 atoms and 281 bonds and a molecular mass of 2074.287 g/mol. It consists of twelve connected units of three connected carbon rings spanning seven carbons atoms each.

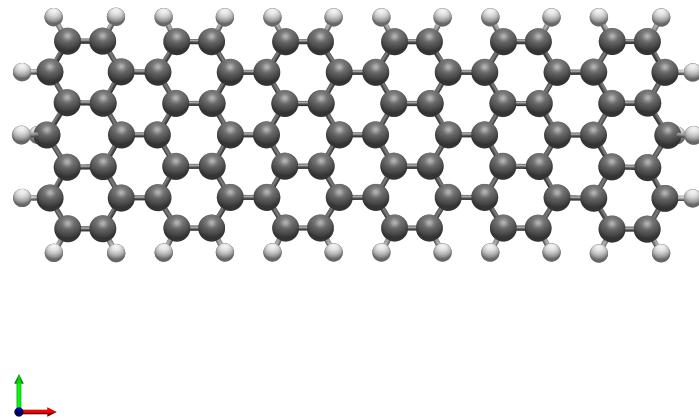


Figure 4.3: 7-AGNR (6 units) molecule.

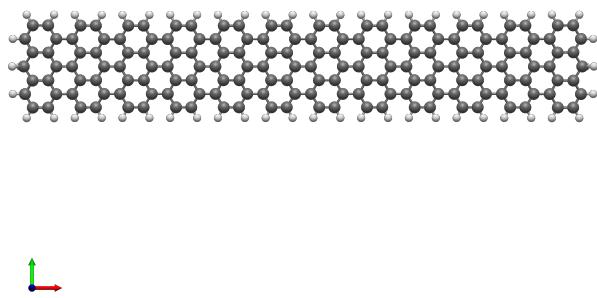


Figure 4.4: 7-AGNR (12 units) molecule.

#### 4.3.3.2 | Defective GNR: 7-AGNR (12 Units): "Bite" Defect

This is the 7-AGNR (12 units) molecule as presented in subsection 4.3.3.1 above, but with a bite-shaped defect in the form of a benzene ring having two carbon atoms removed near the middle of the molecule (figure 4.5). It has the chemical formula  $C_{166}H_{56}$  with a total count of 222 atoms and 278 bonds and a molecular mass of 2050.265 g/mol.

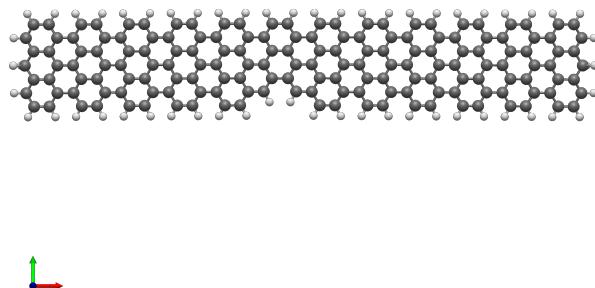


Figure 4.5: Defective 7-AGNR (12 units) molecule: "Bite" defect.

#### 4.3.3.3 | Defective GNR: 7-AGNR (12 Units): Nitrogen Doping

This is the 7-AGNR (12 units) molecule as presented in subsection 4.3.3.1 above, but with two carbon atoms replaced by nitrogen atoms in a single benzene ring near the middle of the molecule (figure 4.6). It has the chemical formula  $C_{166}H_{56}N_2$  with a total count of 224 atoms and 281 bonds and a molecular mass of 2078.277 g/mol.

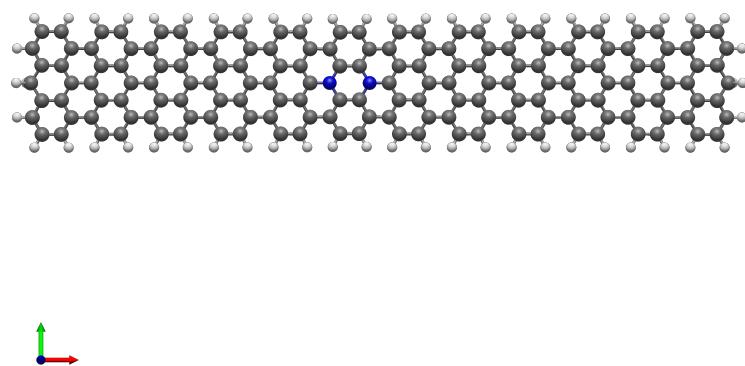


Figure 4.6: Defective 7-AGNR (12 units) molecule: Nitrogen doping.

#### 4.3.3.4 | Defective GNR: 7-AGNR (12 Units): Boron and Nitrogen Doping

This is the 7-AGNR (12 units) molecule as presented in subsection 4.3.3.1 above, but with three carbon atoms replaced by nitrogen atoms intersected with three carbon atoms replaced by boron atoms, overall replacing a single benzene ring near the middle of the molecule (figure 4.7). It has the chemical formula  $C_{162}H_{56}B_3N_3$  with a total count of 224 atoms and 281 bonds and a molecular mass of 2076.657 g/mol.

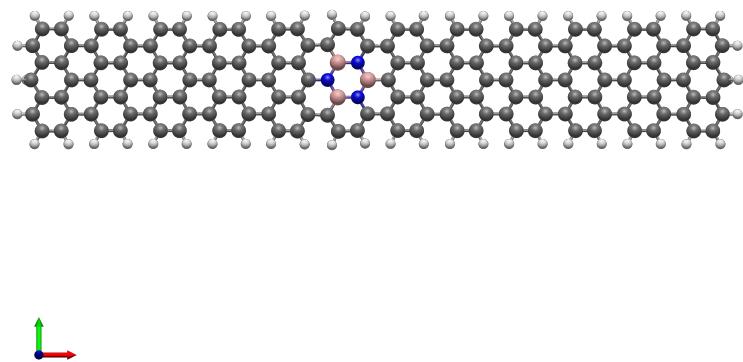


Figure 4.7: Defective 7-AGNR (12 units) molecule: Nitrogen and boron doping.

# Implementation of Computations

## 5.1 | Introduction

This chapter details the computational workflow which is dominated by two components: First, quantum chemical calculations are performed using the atomistic simulation software CP2K (Hutter et al., 2014). In turn, Raman calculations based on intermediate results are performed by a Python/NumPy code. Code files for all workflow steps are openly accessible ((Hubmann, 2020)).

## 5.2 | Workflow Specification

The two main computational components of the workflow as mentioned above are bookended by the preparatory steps and the plotting of the obtained Raman spectra. Figure 5.1 depicts the complete workflow.

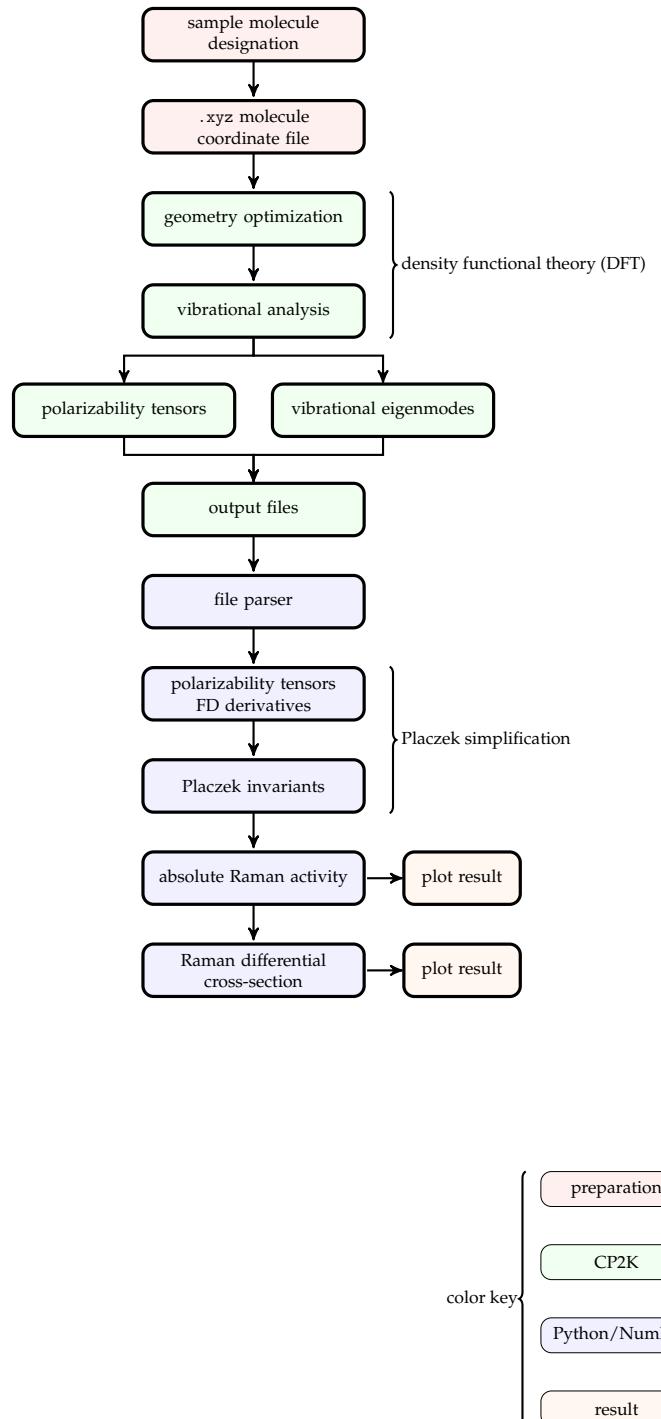


Figure 5.1: Workflow for computing Raman characteristics.

## 5.3 | Workflow Core Sections

### 5.3.1 | Preparatory Steps

First, the chosen sample molecule's geometry is written into a .xyz (XYZ) cartesian coordinate file on a per-atom basis, preferably using the atomic simulation environment (ASE) library (Hjorth Larsen et al., 2017) for Python or alternatively a semantic chemical editor such as Avogadro (Hanwell et al., 2012).

### 5.3.2 | Quantum Chemical Calculations: CP2K

CP2K (Hutter et al., 2014) is an open-source atomistic simulation tool in the field of density functional theory (DFT) based molecular dynamics. It is highly versatile with respect to the computational methods and the combinations thereof to solve a given problem. Its capability to describe the dynamics of large systems with hundreds of atoms render it very well suited to the study of GNRs and their properties. Out of CP2K's many functionalities, this study uses DFT based forces to first optimize atomic positions within the sample molecules towards an energetic minimum and then to perform a full vibrational analysis of the samples based on finite differences:

The .xyz coordinate file is read into CP2K to perform a geometry optimization to relax the molecule into energetically optimal conformation.

After calculating the optimized atomic coordinates, the resulting file serves as the basis for the DFT based vibrational analysis.

The CP2K input configuration files for a typical geometry optimization and vibrational analysis is given in appendix A.

### 5.3.3 | Computing Raman Spectra: Python with NumPy

Following the vibrational analysis step, a Python program reads the optimized molecule geometry together with all CP2K output files and parses their content into NumPy (van der Walt et al., 2011) data structures.

The Python program then calculates the polarizability tensor first derivatives with regard to cartesian coordinates using a central finite differences 3-point scheme. From this, the mass weighted polarizability tensor first derivatives with regard to normal coordinates of the vibrational modes are calculated.

With the key elements of the Raman tensor for each vibrational mode now computed, the Placzek invariants for mean polarizability, anisotropy and asymmetric anisotropy

are computed. Based on the three Placzek invariants, the parameter-independent absolute Raman intensity for the common experimental setup is calculated.

Finally, the Raman cross-section depending on incident radiation source frequency and experimental system temperature is computed from the absolute Raman activity and plotted for further analysis.

# Results

## 6.1 | Introduction

This chapter presents the computed absolute total Raman intensities  $I(\perp^s + \parallel^s, \perp^{\text{inci}})$  as well as the computed Raman total cross-sections  $\sigma'_i(\perp^s + \parallel^s; \tilde{\nu}_L, T)$  over the full spectrum of vibrational modes computed by CP2K for all three groups of sample molecules.

The system temperature is set at  $T = 300\text{K}$  for all calculations.

For the small-to-medium GNRs group where experimental data is available (section 6.3), the illuminating laser's wavenumber is chosen to match common experimental wavelengths of  $\lambda_L \in \{532\text{nm}, 785\text{nm}\}$  as well as the commonly reported limit case of  $\lambda_L \rightarrow 0\text{nm}$  which is independent of the specific experimental choice of excitation radiation source.

For the verification group (section 6.2.1) as well as the group of medium-to-large AGNRs (section 6.4), the latter's focus being on identifying intergroup fingerprint differences, only the limit case of  $\lambda_L \rightarrow 0\text{nm}$  is reported for comparison.

The full set of calculated intensities and cross-sections is available in appendix C.

## 6.2 | Verification Group with Reference Data

### 6.2.1 | Ethane

The total Raman intensity is shown in figure 6.1, and the total Raman cross-section is shown in figure 6.2.

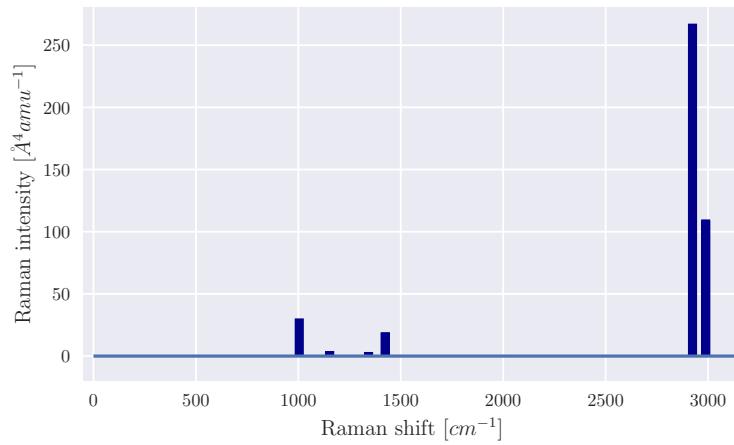


Figure 6.1: Computed Ethane total Raman intensity.

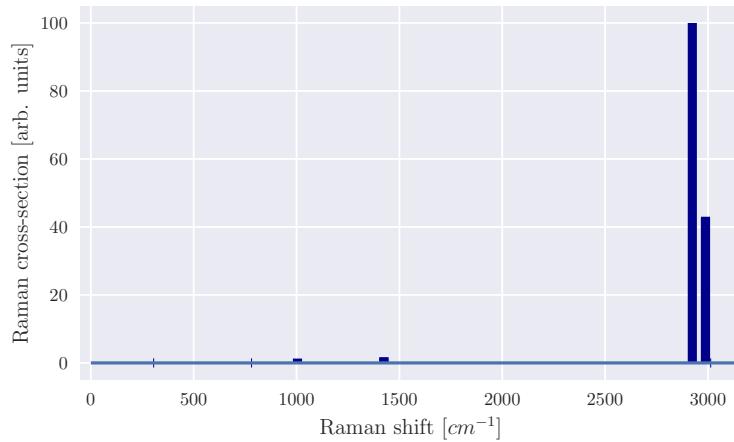


Figure 6.2: Computed Ethane ( $\lambda_L = 0 \text{ nm}$ ) total Raman cross-section.

## 6.3 | Small-to-medium GNRs Group with Experimental Data

### 6.3.1 | 7-AGNR (3 Units)

The total Raman intensity is shown in figure 6.3, and the total Raman cross-sections are shown in figures 6.4, 6.5, and 6.6.

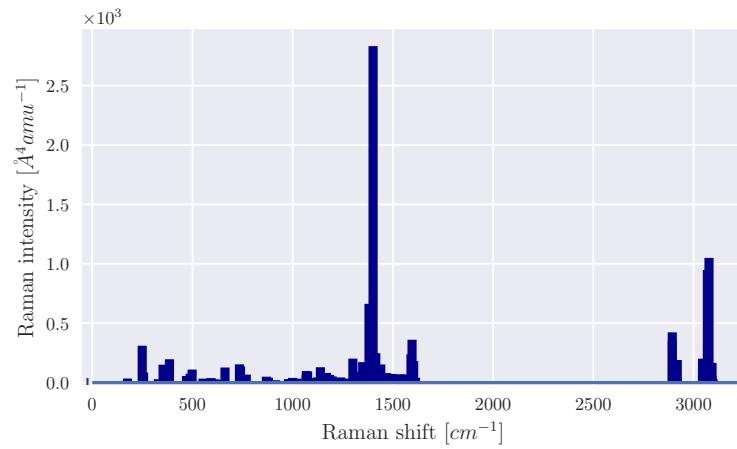


Figure 6.3: Computed 7-AGNR (3 units) total Raman intensity.

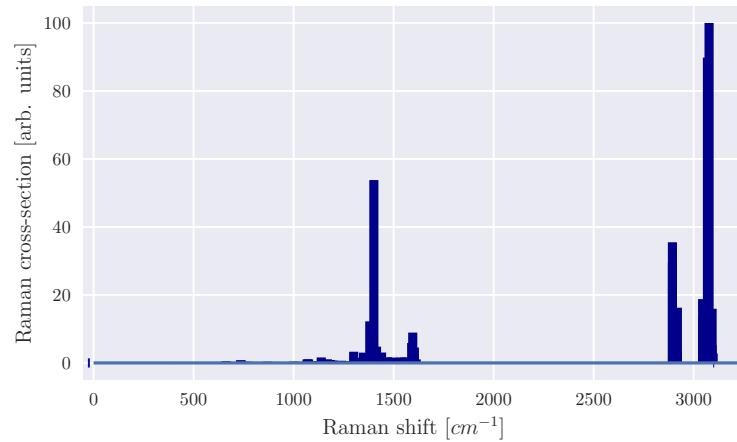


Figure 6.4: Computed 7-AGNR (3 units) ( $\lambda_L = 0 \text{nm}$ ) total Raman cross-section.

### 6.3.2 | 7-AGNR (6 Units)

The total Raman intensity is shown in figure 6.7, and the total Raman cross-sections are shown in figures 6.8, 6.9, and 6.10.

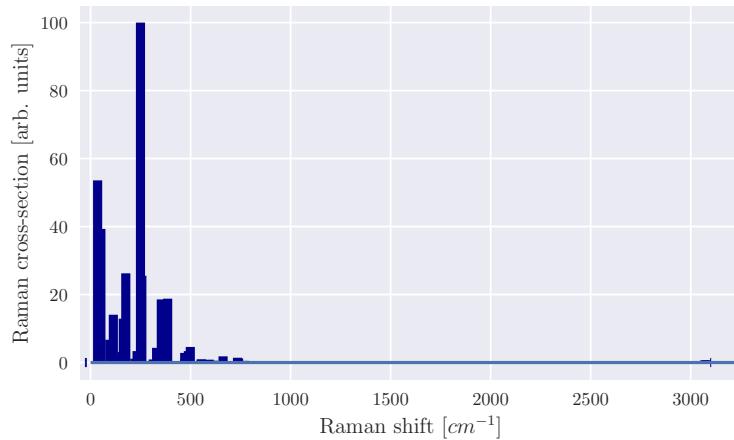


Figure 6.5: Computed 7-AGNR (3 units) ( $\lambda_L = 532\text{nm}$ ) total Raman cross-section.

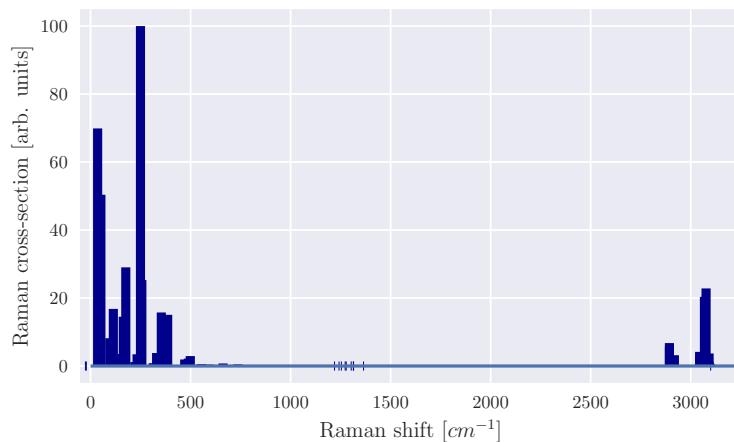


Figure 6.6: Computed 7-AGNR (3 units) ( $\lambda_L = 785\text{nm}$ ) total Raman cross-section.

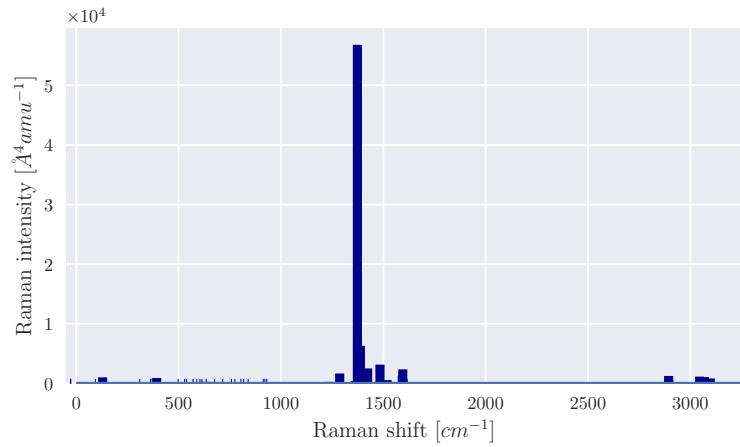


Figure 6.7: Computed 7-AGNR (6 units) total Raman intensity.

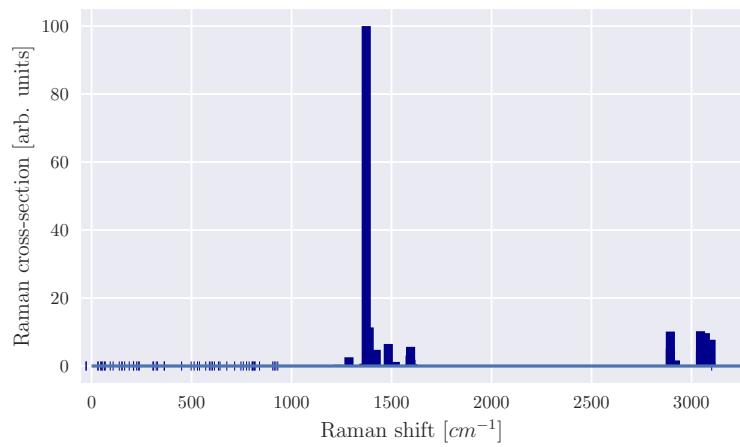


Figure 6.8: Computed 7-AGNR (6 units) ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section.

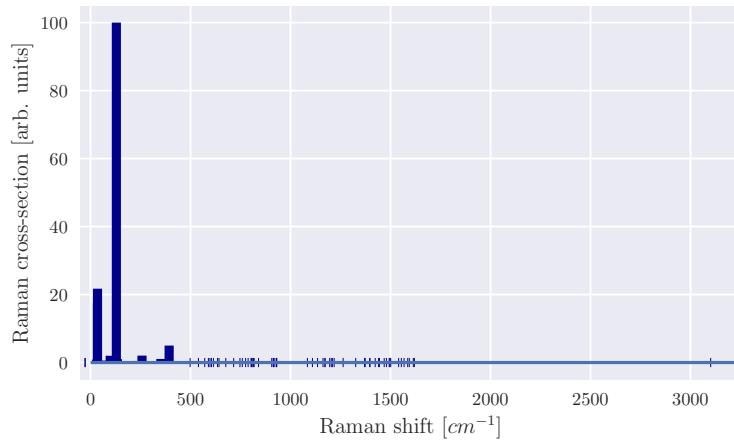


Figure 6.9: Computed 7-AGNR (6 units) ( $\lambda_L = 532\text{nm}$ ) total Raman cross-section.

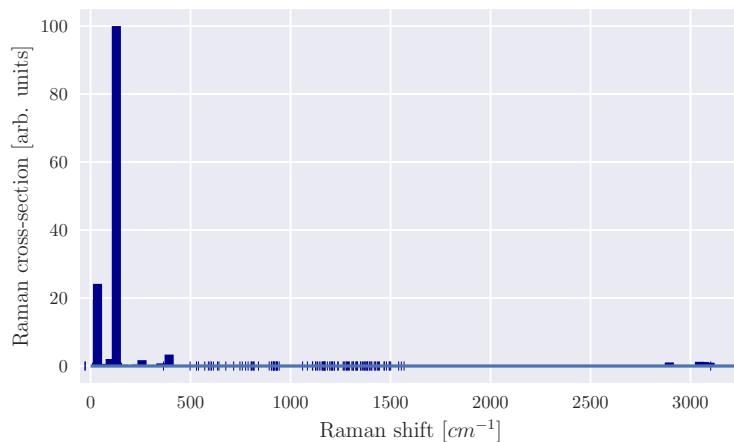


Figure 6.10: Computed 7-AGNR (6 units) ( $\lambda_L = 785\text{nm}$ ) total Raman cross-section.

## 6.4 | Medium-to-large GNRs Group including Common Defects

### 6.4.1 | 7-AGNR (12 Units)

The total Raman intensity is shown in figure 6.11, and the total Raman cross-section is shown in figure 6.12.

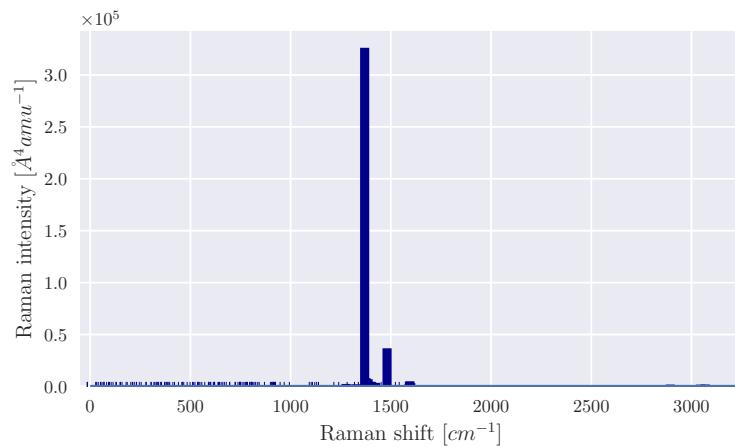


Figure 6.11: Computed 7-AGNR (12 units) total Raman intensity.

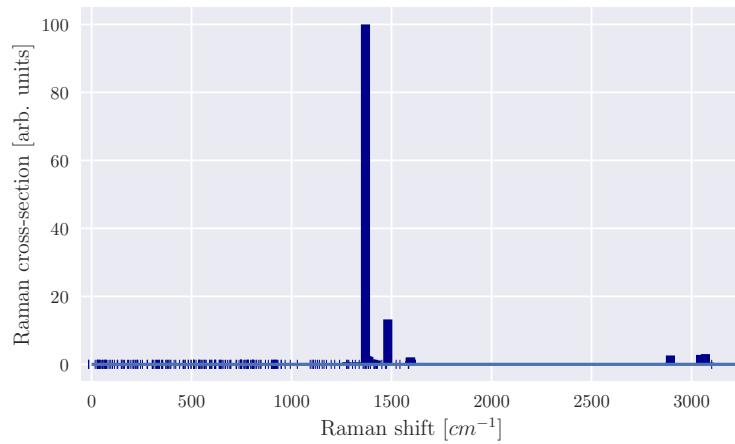


Figure 6.12: Computed 7-AGNR (12 units) ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section.

#### 6.4.2 | 7-AGNR (12 Units): "Bite" Defect

The total Raman intensity is shown in figure 6.13, and the total Raman cross-section is shown in figure 6.14.

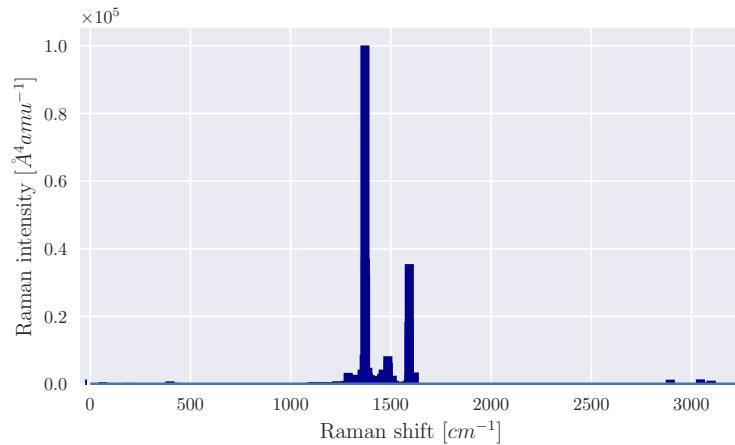


Figure 6.13: Computed 7-AGNR (12 units) large "bite" defect total Raman intensity.

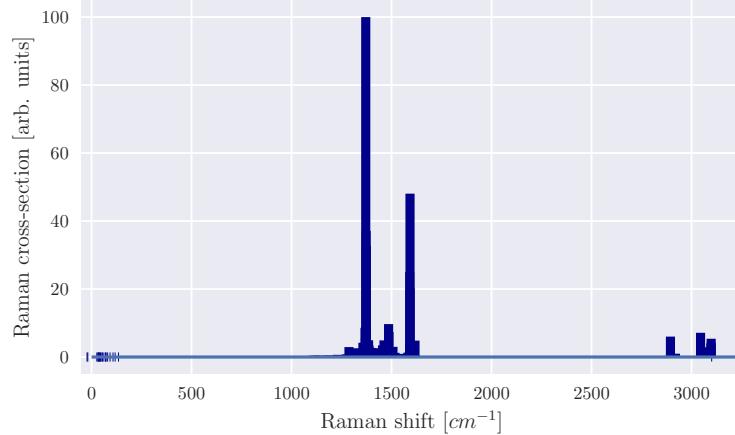


Figure 6.14: Computed 7-AGNR (12 units) large "bite" defect ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section.

### 6.4.3 | 7-AGNR (12 Units): Nitrogen Doping

The total Raman intensity is shown in figure 6.15, and the total Raman cross-section is shown in figure 6.16.

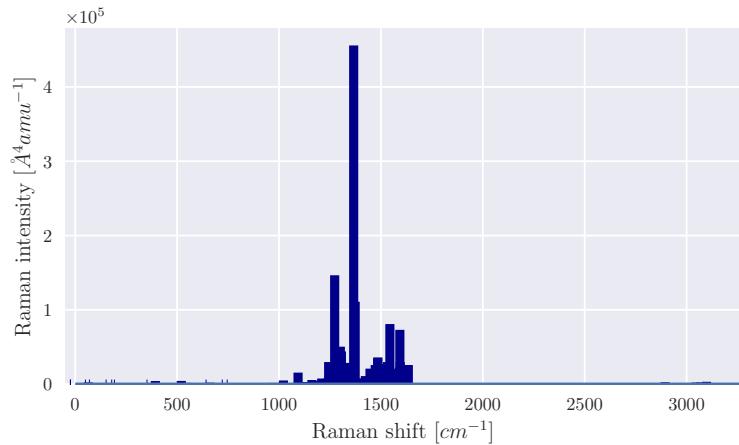


Figure 6.15: Computed 7-AGNR (12 units) nitrogen doping total Raman intensity.

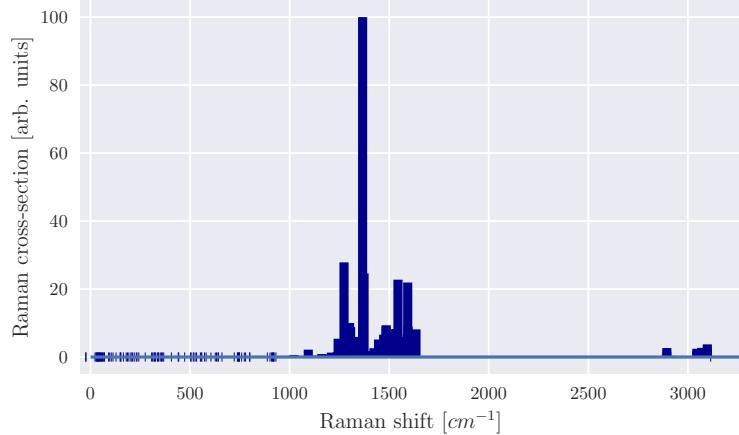


Figure 6.16: Computed 7-AGNR (12 units) nitrogen doping ( $\lambda_L = 0 \text{nm}$ ) total Raman cross-section.

#### 6.4.4 | 7-AGNR (12 Units): Boron and Nitrogen Doping

The total Raman intensity is shown in figure 6.17, and the total Raman cross-section is shown in figure 6.18.

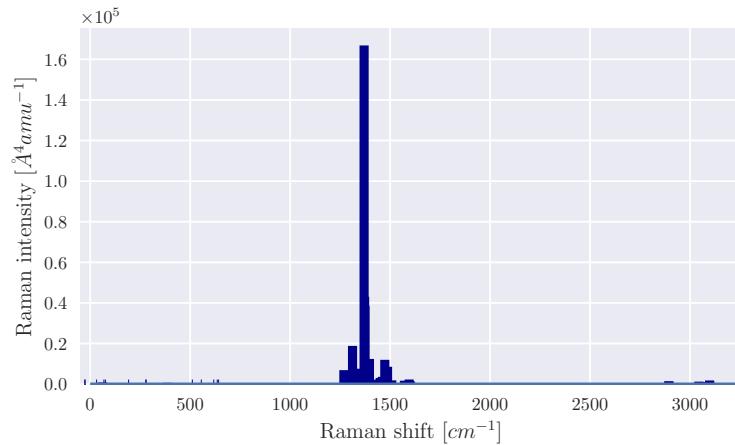


Figure 6.17: Computed 7-AGNR (12 units) nitrogen and boron doping total Raman intensity.

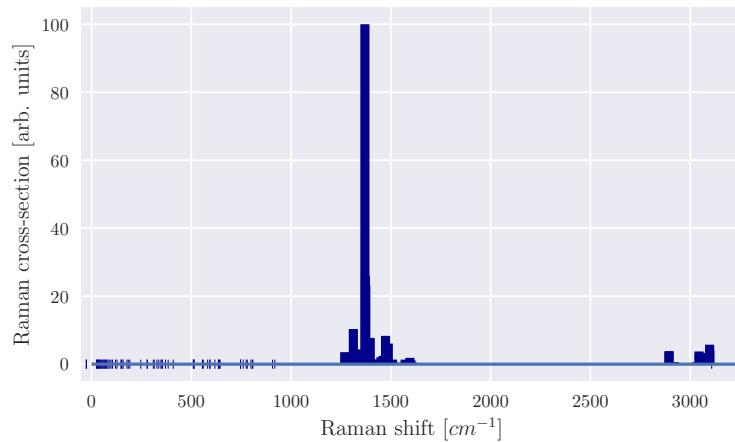


Figure 6.18: Computed 7-AGNR (12 units) nitrogen and boron doping ( $\lambda_L = 0 \text{ nm}$ ) total Raman cross-section.

# Discussion

## 7.1 | Introduction

This chapter compares the obtained Raman characteristics to the available results from experiments where available and makes an attempt to discuss discrepancies where warranted. Comparing the Raman spectra of the defective samples with each other, an attempt at identifying fingerprints peculiar to specific defects is made.

Finally, we consider the suitability of the chosen computational workflow in terms of ease of use and performance.

## 7.2 | Verification Group: Comparison with Reference Data

The molecule Ethane ( $C_2H_6$ ) was chosen to serve as a verification case for the basic suitability of the chosen computational approach. The published reference data from experiment is given in table 7.1.

Plotting the values from experiment (table 7.1) with the plotting functionality developed in this study results in figure 7.1.

Comparing the reference spectrum from figure 7.1 with the computed total Raman intensity as given in figure 6.1 from section 6.2.1 shows a very good match, confirming the viability of the chosen approach.

Mode	$\nu$ $\text{cm}^{-1}$			$I^{\text{IR}}$ $(\text{D}/\text{\AA})^2 \text{ amu}^{-1}$			$I^{\text{Raman}}$ $\text{\AA}^4 \text{ amu}^{-1}$		
	LDA		GGA	Exp	LDA	GGA	Exp	LDA	GGA
$1A_{1u}$	301	297	303	0.0	0.0	0.0	0.0	0.0	0.0
$1E_u$	780	800	822	0.317	0.200	0.149	0.0	0.0	0.0
$1A_{1g}$	1026	998	1016	0.0	0.0	0.0	9.32	10.7	13.4
$1E_g$	1151	1177	1246	0.0	0.0	0.0	0.347	0.226	0.6
$1A_{2u}$	1323	1354	1438	0.128	0.033	0.059	0.0	0.0	0.0
$2A_{1g}$	1342	1361	1449	0.0	0.0	0.0	0.385	0.121	0.2
$2E_u$	1419	1456	1526	0.656	0.446	0.373	0.0	0.0	0.0
$2E_g$	1420	1457	1552	0.0	0.0	0.0	17.0	16.8	17.8
$2A_{2u}$	2946	2973	3061	1.140	1.395	1.226	0.0	0.0	0.0
$3A_{1g}$	2947	2969	3043	0.0	0.0	0.0	400	368	302
$3E_g$	3011	3022	3175	0.0	0.0	0.0	272	260	290
$3E_u$	3034	3055	3140	1.683	2.694	2.983	0.0	0.0	0.0

Table 7.1: Ethane reference total Raman intensities (Porezag and Pederson, 1996).

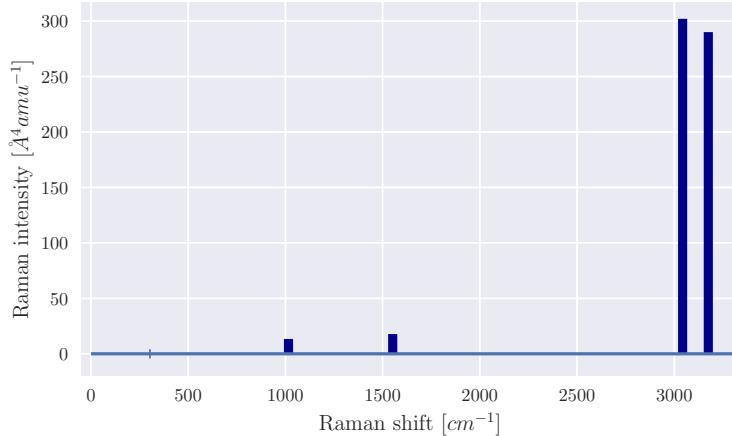


Figure 7.1: Plotted Ethane reference experimental total Raman intensities (Porezag and Pederson, 1996).

### 7.3 | Small-to-medium GNRs Group: Comparison with Experimental Data

The two sizes (3 units and 6 units) of 7-AGNR were chosen to be representative of simple GNRs typically fabricated at Empa.

The experimentally obtained total Raman intensity for 7-AGNR (3 units) is shown in figure 7.2.

While ?? at first glance shows little resemblance to the 7-AGNR results reported in section 6.3 of the previous chapter, it needs to be noted that the wavenumber cutoff in the experimental data is set at  $1800\text{cm}^{-1}$ , while the calculated spectrum contains data up to  $3100\text{cm}^{-1}$ .

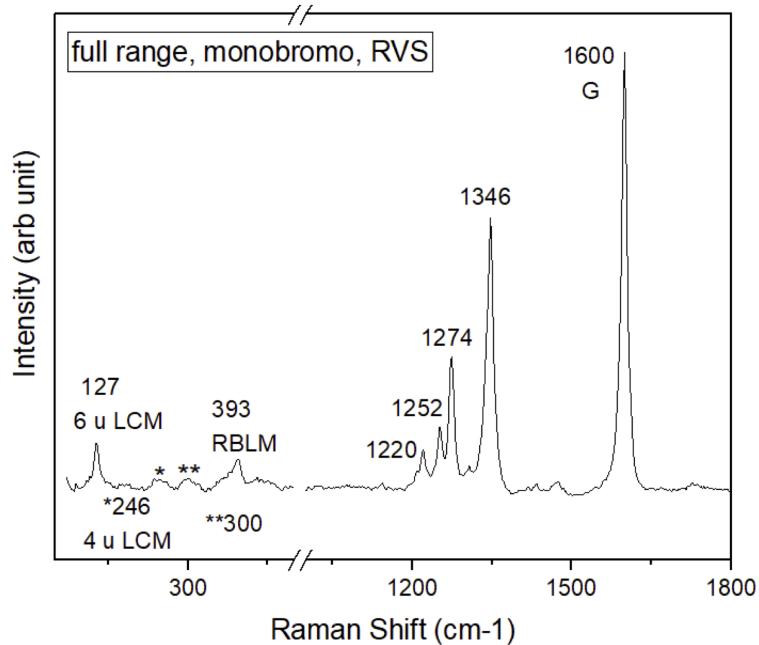


Figure 7.2: 7-AGNR reference experimental total Raman intensity (Borin Barin, 2020).

Comparing computed and experimentally obtained Raman characteristics yields several observations:

Unlike in the Ethane case considered before, the Raman intensity spectra only match somewhat well. While especially the 400nm, 1350nm and 1600nm peaks align reasonably well both for both the 3-unit and the 6-unit samples of 7-AGNR, the peak heights do not line up in all cases.

Looking at the Raman cross-section calculated with a typical laser wavelength of  $\lambda_L = 532\text{nm}$  does not help clarifying the diagnosis. While there are no Raman cross-sections reported from experiment, the pattern of cross sections concentrated at lower energies leaves no conspicuous hint as to the non-matching of the Raman intensities reported above.

There are multiple possible reasons for the unsatisfactory match between computed and experimentally obtained Raman intensity spectra, the further investigation of which would go beyond the scope of this report. A shortlist of possible routes of investigation should include the following (Walter and Moseler, 2020): Unlike in the case of organic molecules such as Ethane, the typical excitation wavelengths  $\lambda_L$  fall well within the electronic excitation frequencies of larger molecules such as 7-AGNR, which is completely ignored by the Placzek approximation. Furthermore, no anharmonic effects or mode mixing which both are of second order in the derivative after the vibrational coordi-

nates and are likely to be prevalent in large molecules of the GNR type are considered in the Placzek approximation. Finally, before even considering the shortcomings of the Placzek approximation as such, it could be examined whether stricter convergence criteria in when performing the quantum chemical harmonic approximation for finding the vibrational normal modes improve the precision. Likewise, a higher order finite difference method when calculating the Raman tensor could help to eliminate higher order errors.

## 7.4 | Medium-to-large GNRs Group: Distinction between Common Defects

First comparing the obtained Raman characteristics for the larger 12 unit-sized 7-AGNR with the results of the smaller 7-AGNRs studied in the previous group, the obvious consistencies instill confidence in the correctness and reliability of the calculations.

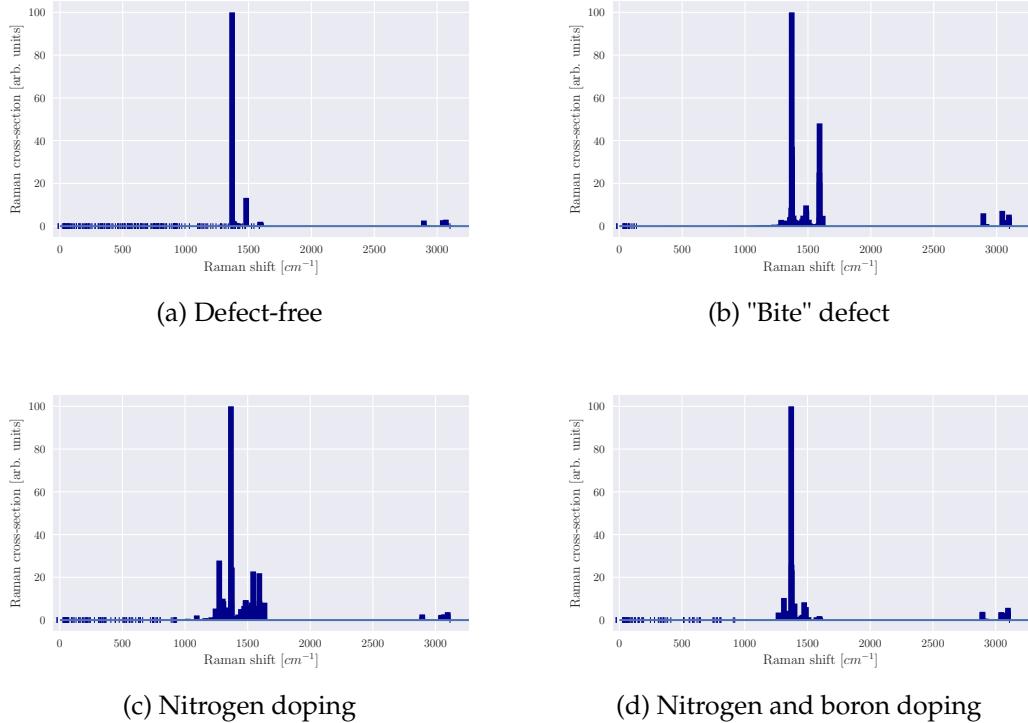


Figure 7.3: 7-ANGR (12 units): Comparison of computed ( $\lambda_L = 0\text{nm}$ ) total Raman cross-sections for examined configurations.

Taking a closer look at the similarities and differences between the pristine version of 7-AGNR (12 units) and its four defective siblings allows a favorable assessment of the

chosen approach when it comes to identify fingerprint differences between GNRs with only minor structural differences:

All investigated forms of 7-AGNR (12 units) share a qualitatively similar basic spectrum with two main peak groups, of which the markedly larger first group has a primary peak around  $1350\text{cm}^{-1}$  and a secondary peak around  $1500\text{cm}^{-1}$ , while the smaller second group has several minor peaks around  $3000\text{cm}^{-1}$ .

As figure 7.3 compiled from section 6.4 clearly shows, the four studied forms of 7-AGNR (12 units) can be differentiated by their respective Raman cross-sections:

The "bite" defect form of 7-AGNR (12 units) shows a basic spectrum almost similar to the pristine version's, but with a distinct amplification of the peak around  $1600\text{cm}^{-1}$  peak.

Second under investigation, the nitrogen doping defect form of 7-AGNR (12 units), while being noisier overall, adds a new secondary peak at  $1250\text{cm}^{-1}$  peak while reducing the  $1500\text{cm}^{-1}$  peak and having a both somewhat amplified and broadened peak around  $1600\text{cm}^{-1}$ .

Finally, the nitrogen plus boron doping defect form of 7-AGNR (12 units), while showing more noise in the two peak groups than the pristine version, has all peaks except the main  $1350\text{cm}^{-1}$  peak almost completely suppressed.

In summary, the calculated Raman characteristics allow identifying the examined molecules as members of the 7-AGNR family, while a clear distinction between the pristine form and each of the studied three common defect types is easily possible.

## 7.5 | Quantum Chemical Calculations with CP2K

The quantum chemical part of the computations performed with CP2K were performed without encountering any stability or performance issues. Due a vibrational analysis requiring calculation of the molecular energy for a positive and a negative displacement per atom per dimension, the density functional theory based calculations run in the order of  $\mathcal{O}(6n + 1)$  where  $n$  is the number of atoms in a molecule. These calculations thus are relatively expensive with growing molecule size and take considerable computational time: While geometry optimizations run in the order of minutes to hours on 4 nodes of the Swiss National Supercomputing Centre's Piz Daint supercomputer with 12 cores (Intel Xeon E5-2690v3) each, a vibrational analysis for the molecule sizes found in this study runs in the order of several hours on 24-48 nodes of the same supercomputer.

## 7.6 | Computing Raman Characteristics with Python and NumPy

Implementing the calculation of Raman intensities and cross-sections by way of the Placzek approximation using Python with NumPy poses no stability or performance issues. Running the complete code including the parsing, computation and output plotting reliably takes in the order of seconds on a single core of an Intel Core i9-8950HK (Coffee Lake) laptop system.

## Conclusion

The chosen computational approach to compute Raman characteristics using the density functional theory based harmonic approximation for molecule vibrational normal modes and the Placzek approximation to compute the Raman tensor invariants is shown to be viable in principle.

While very close for small molecules, the similarity match between calculated and experimentally measured Raman characteristics is not perfect for larger molecules such as GNRs. Further calculations are required to determine whether higher numerical and quantum chemical precision when determining the molecule vibrational normal modes would increase the overlap of computed Raman characteristics with experimental data or if the Placzek approximation suffers from too many inherent simplifications to make it an ideal choice for larger molecules of the GNR class.

The chosen method however seems very well suited to identifying and clearly distinguishing specific fingerprint patterns of defects commonly occurring in the bottom-up fabrication of GNRs. This is all the more impressive considering the differences between the studied sample molecules are in the low single-digit percentage range in terms of both molecular mass and overall atom count.

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# Representative CP2K Configuration Files

## Geometry Optimization Input File cp2k.inp

---

```
1 &FORCE_EVAL
2   METHOD Quickstep
3   &DFT
4     BASIS_SET_FILE_NAME ./BR
5     POTENTIAL_FILE_NAME ./GR
6     RESTART_FILE_NAME ./PROJ-RESTART.wfn
7   #   &PRINT
8   #     &MOMENTS
9   #     &END
10  #    &END
11  &QS
12    METHOD GPW
13    EXTRAPOLATION ASPC
14    EXTRAPOLATION_ORDER 3
15    EPS_DEFAULT 1.0E-14
16  #    MAP_CONSISTENT
17  &END QS
18  &MGRID
19    CUTOFF 600
20    NGRIDS 5
21  &END
```

```
22      &SCF
23          MAX_SCF 20
24          SCF_GUESS ATOMIC
25          EPS_SCF 1.0E-9
26      &OT
27          PRECONDITIONER FULL_SINGLE_INVERSE
28          MINIMIZER CG
29      &END
30      &OUTER_SCF
31          MAX_SCF 15
32          EPS_SCF 1.0E-9
33      &END
34      &PRINT
35          &RESTART
36              &EACH
37                  QS_SCF 0
38                  GEO_OPT 1
39              &END
40          ADD_LAST NUMERIC
41          FILENAME RESTART
42      &END
43          &RESTART_HISTORY OFF
44      &END
45      &END
46  &END SCF
47  &XC
48      &XC_FUNCTIONAL PADE
49  &END XC_FUNCTIONAL
50  &END XC
51  &END DFT
52  &SUBSYS
53  &CELL
54      ABC 10 10 10
55  &END
56  &TOPOLOGY
57      COORD_FILE_NAME ./c2h6.xyz
```

```
58      COORDINATE xyz
59      &END
60      &KIND C
61          BASIS_SET TZV2P-MOLOPT-GTH
62          POTENTIAL GTH-PBE-q4
63      &END KIND
64      &KIND H
65          BASIS_SET TZV2P-MOLOPT-GTH
66          POTENTIAL GTH-PBE-q1
67      &END KIND
68      &END SUBSYS
69  &END FORCE_EVAL
70  &GLOBAL
71      PRINT_LEVEL LOW
72      PROJECT PROJ
73 #  RUN_TYPE NORMAL_MODES
74      RUN_TYPE GEO_OPT
75      WALLTIME 86000
76      EXTENDED_FFT_LENGTHS
77  &END GLOBAL
78
79  &MOTION
80      &GEO_OPT
81          MAX_FORCE 0.00005 # 0.0001 a.u. = 0.005 ev/ang
82          MAX_ITER 1600
83          OPTIMIZER BFGS
84      &BFGS
85          TRUST_RADIUS [bohr] 0.1
86      &END
87  &END
88  &END
89
90 #&VIBRATIONAL_ANALYSIS
91 #  NPROC REP 3
92 #  DX 0.005
93 #  INTENSITIES
```

```
94 #      &PRINT
95 #      &PROGRAM_RUN_INFO ON
96 #      &END
97 #      &END
98 #&END
99
100 #&EXT_RESTART
101 # RESTART_FILE_NAME ./PROJ-1.restart
102 #&END
```

---

## Vibrational Analysis Input File cp2k.inp

---

```
1 &FORCE_EVAL
2   METHOD Quickstep
3   &DFT
4     BASIS_SET_FILE_NAME ./BR
5     POTENTIAL_FILE_NAME ./GR
6     RESTART_FILE_NAME ./PROJ-RESTART.wfn
7     &PRINT
8       &MOMENTS
9     &END
10    &END
11    &QS
12      METHOD GPW
13      EXTRAPOLATION ASPC
14      EXTRAPOLATION_ORDER 3
15      EPS_DEFAULT 1.0E-14
16 #      MAP_CONSISTENT
17    &END QS
18    &MGRID
19      CUTOFF 600
20      NGRIDS 5
21    &END
22    &SCF
23      MAX_SCF 20
```

```
24      SCF_GUESS RESTART
25      EPS_SCF 1.0E-9
26      &OT
27          PRECONDITIONER FULL_SINGLE_INVERSE
28          MINIMIZER CG
29      &END
30      &OUTER_SCF
31          MAX_SCF 15
32          EPS_SCF 1.0E-9
33      &END
34      &PRINT
35          &RESTART
36              &EACH
37                  QS_SCF 0
38                  GEO_OPT 1
39              &END
40          ADD_LAST NUMERIC
41          FILENAME RESTART
42      &END
43      &RESTART_HISTORY OFF
44      &END
45      &END
46  &END SCF
47  &XC
48      &XC_FUNCTIONAL PADE
49  &END XC_FUNCTIONAL
50  &END XC
51  &END DFT
52  &PROPERTIES
53      &LINRES
54          MAX_ITER 2000
55          PRECONDITIONER FULL_ALL
56          EPS 1E-6
57          &POLAR
58          DO_RAMAN T
59      &END
```

```
60      &END
61      &END
62      &SUBSYS
63          &CELL
64              ABC 10 10 10
65          &END
66          &TOPOLOGY
67              COORD_FILE_NAME ./c2h6-opt.xyz
68              COORDINATE xyz
69          &END
70          &KIND C
71              BASIS_SET TZV2P-MOLOPT-GTH
72              POTENTIAL GTH-PBE-q4
73          &END KIND
74          &KIND H
75              BASIS_SET TZV2P-MOLOPT-GTH
76              POTENTIAL GTH-PBE-q1
77          &END KIND
78      &END SUBSYS
79  &END FORCE_EVAL
80  &GLOBAL
81      PRINT_LEVEL LOW
82      PROJECT PROJ
83      RUN_TYPE NORMAL_MODES
84 # RUN_TYPE GEO_OPT
85      WALLTIME 86000
86      EXTENDED_FFT_LENGTHS
87  &END GLOBAL
88
89  &VIBRATIONAL_ANALYSIS
90      NPROC REP 3
91      DX 0.001
92      INTENSITIES
93      &PRINT
94          &PROGRAM_RUN_INFO ON
95      &END
```

```
96      &END
97  &END
98
99  #&EXT_RESTART
100 # RESTART_FILE_NAME ./PROJ-1.restart
101 #&END
```

---

# Python Source Code Key Excerpts

## Computing the Raman Tensor from the Polarizability Tensor

---

```
1  # FDM 3-point first derivative of polarizability tensors:
2
3  # dx in cp2k is in Bohr, polarizability tensors are in Angstrom^3:
4  bohr2ang = 0.5291772109
5  factor = 1 / (2 * dx * bohr2ang)
6
7  # polarizability tensor derivatives w.r.t. cartesian coordinates
8  # in Angstrom^2:
9  polariz_dxxy = factor * (polarizabilities[:, :, 0, :, :] -
10    polarizabilities[:, :, 1, :, :])
11
12  # Calculating Raman tensor from polarizability tensor derivatives,
13  # normal mode displacements, atomic masses
14
15  polariz_dq = np.einsum('ad...,akd,a->k...', polariz_dxxy,
16    normal_displacements, atom_mass_inv_sqrt)
```

---

## Computing the Placzek Invariants

---

```

1  # Placzek tensor invariants
2
3  # mean polarizability squared:
4  a_sq = np.square(np.trace(polariz_dq, 0, 2) / 3).reshape((-1,1))
5
6  # anisotropy:
7  gamma_sq = np.zeros((num_normal_modes,1))
8
9  # asymmetric anisotropy:
10 delta_sq = np.zeros_like(gamma_sq)
11
12 for k in range(num_normal_modes):
13     gamma_sq[k] = 0.5 * (np.square(polariz_dq[k][0][0] -
14                             polariz_dq[k][1][1]) -
15                             +np.square(polariz_dq[k][1][1] -
16                             polariz_dq[k][2][2]) +
17                             np.square(polariz_dq[k][2][2] -
18                             polariz_dq[k][0][0])) \
19                             +3 * (np.square(polariz_dq[k][0][1]) +
20                             np.square(polariz_dq[k][1][2]) +
21                             np.square(polariz_dq[k][2][0]))
22     delta_sq[k] = 0.75 * (np.square(polariz_dq[k][0][1] -
23                             polariz_dq[k][1][0]) +
24                             np.square(polariz_dq[k][0][2] -
25                             polariz_dq[k][2][0]) +
26                             np.square(polariz_dq[k][1][2] -
27                             polariz_dq[k][2][1]))

```

---

## Computing Raman Intensities

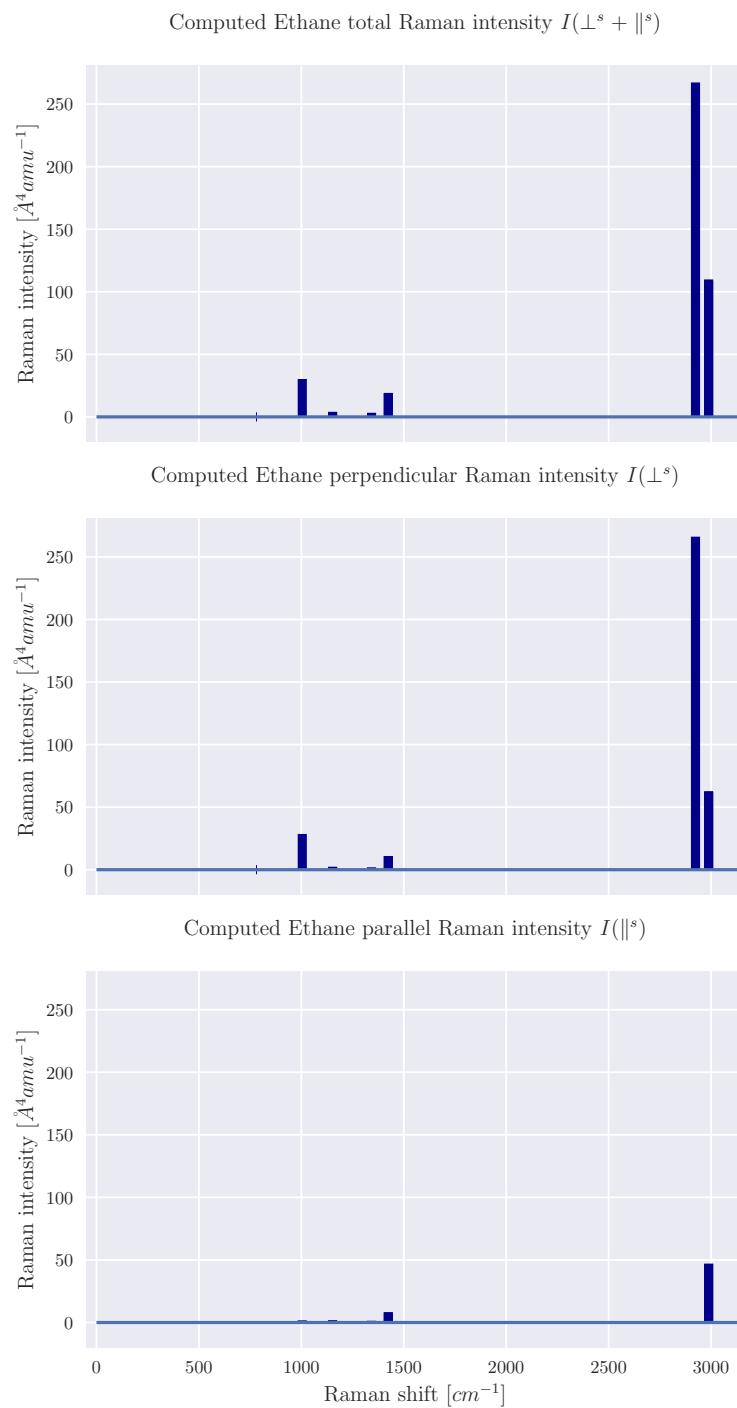
```
1  # calculate absolute Raman intensity: total , perpendicular &
2  # parallel polarized scattering
3
4  I_raman = np.zeros((num_normal_modes,3))
5  for k in range(num_normal_modes):
6      if normal_freqs[k] > 0:  # there are no physical negative
7          normal frequencies
8          I_raman[k] = 45 * a_sq[k] + 7 * gamma_sq[k] + 5 * delta_sq
9              [k], \
10                 45 * a_sq[k] + 4 * gamma_sq[k]
11                 , \
12                 3 * gamma_sq[k] + 5 * delta_sq
13                     [k]
```

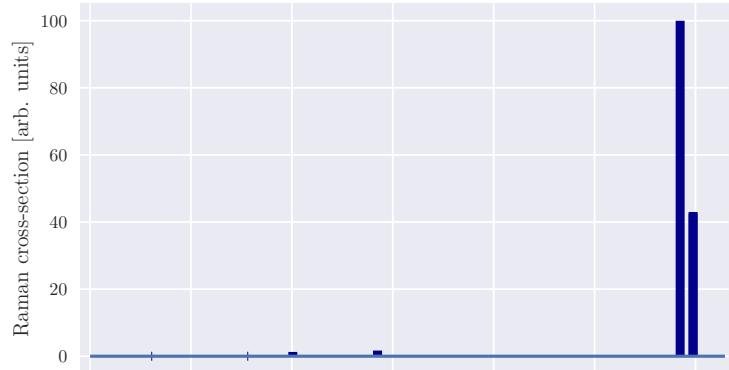
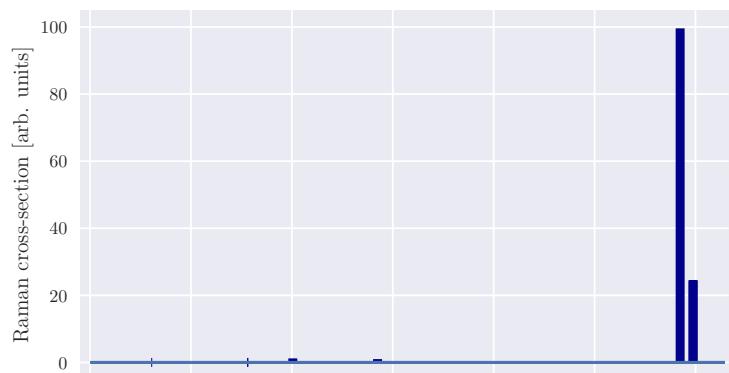
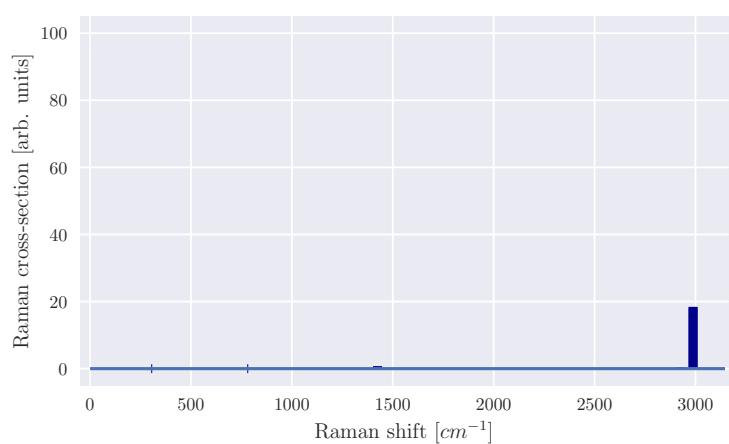
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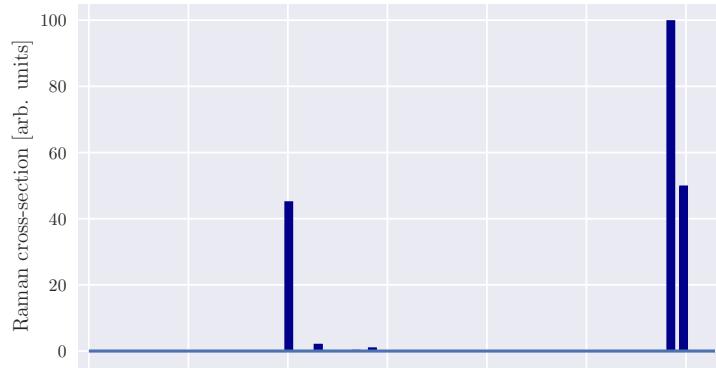
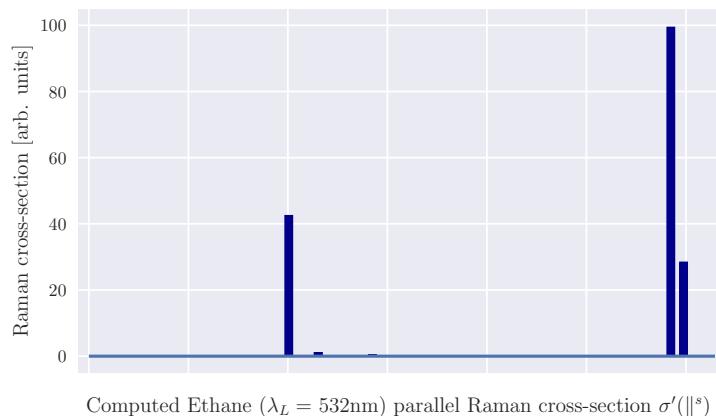
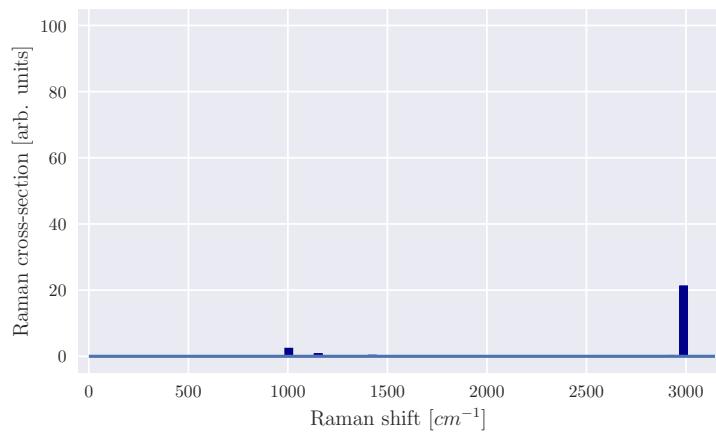
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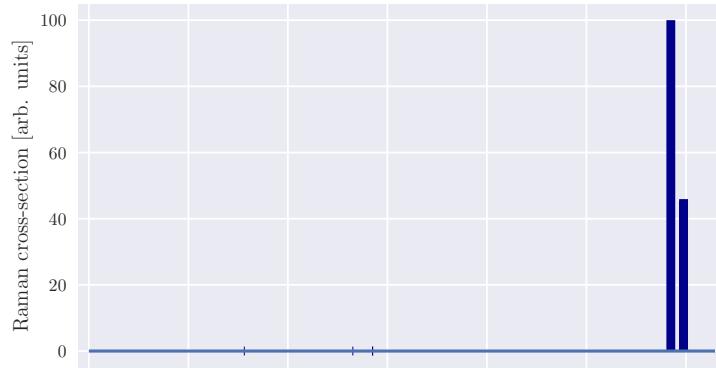
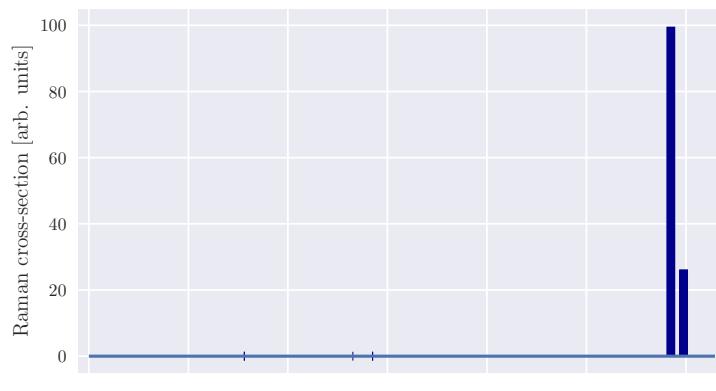
## Supplementary Results

Ethane

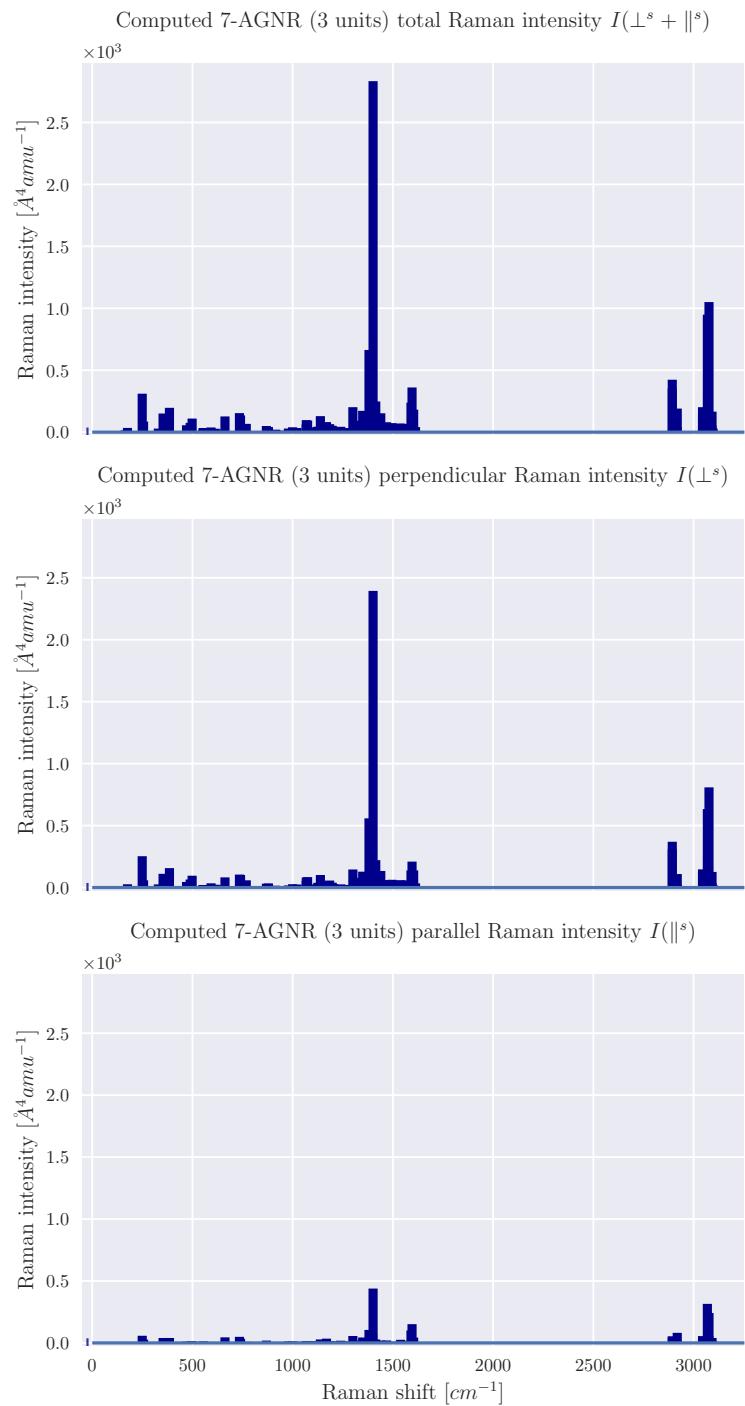


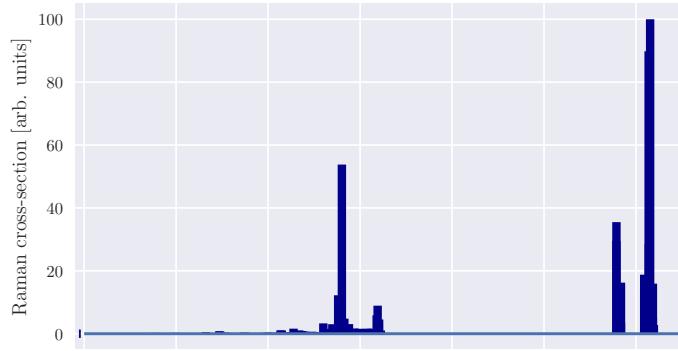
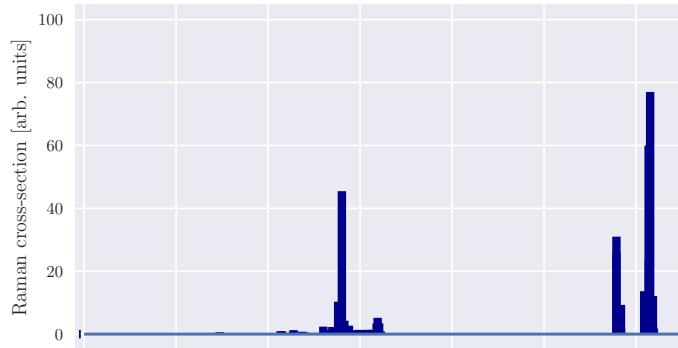
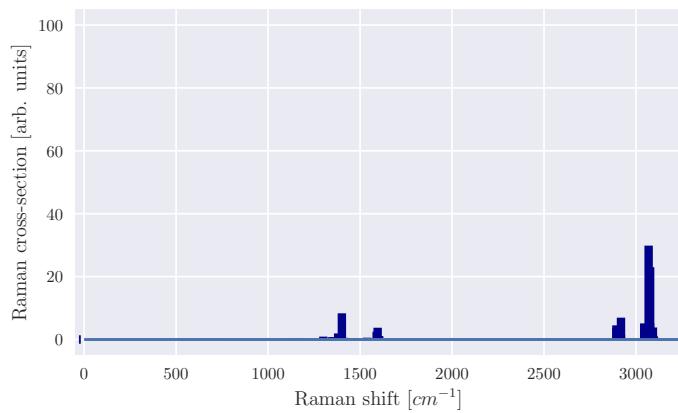
Computed Ethane ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed Ethane ( $\lambda_L = 0\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed Ethane ( $\lambda_L = 0\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

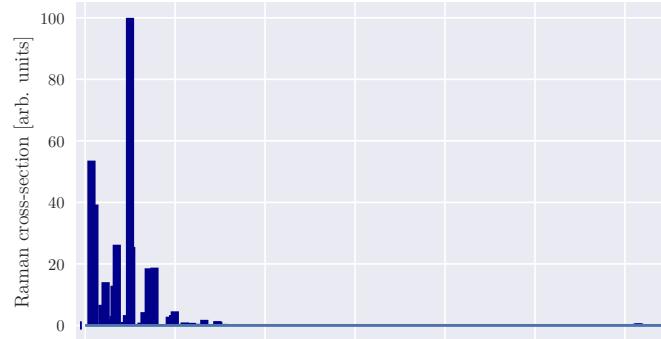
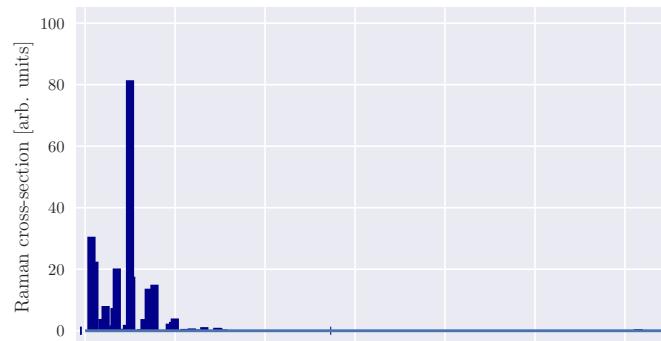
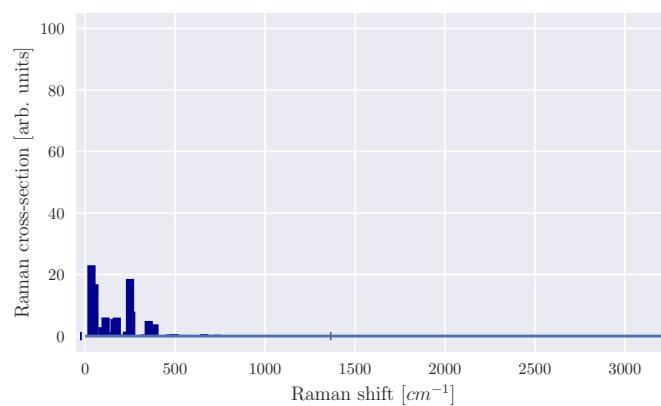
Computed Ethane ( $\lambda_L = 532\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed Ethane ( $\lambda_L = 532\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed Ethane ( $\lambda_L = 532\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

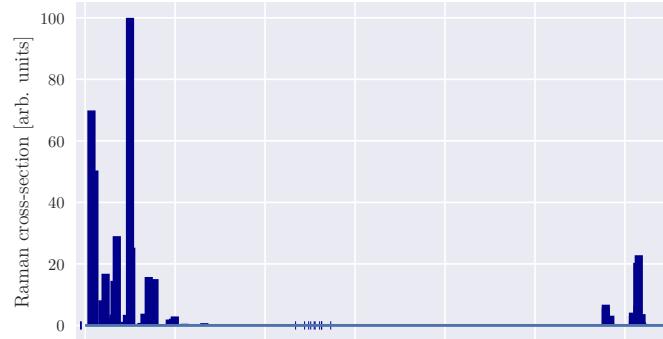
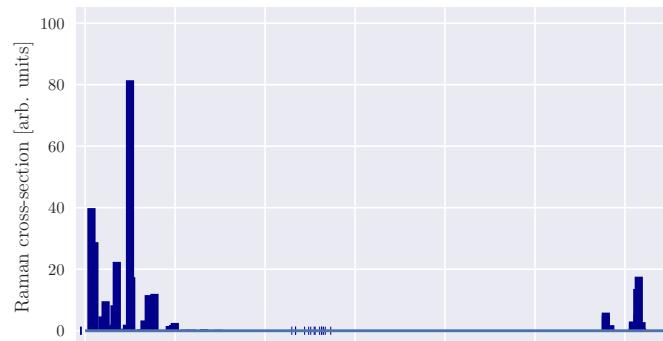
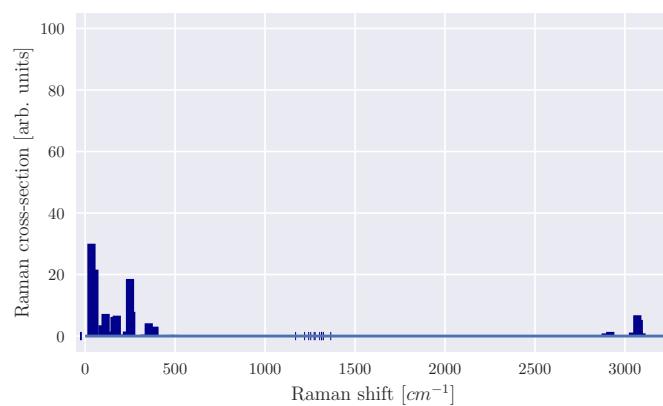
Computed Ethane ( $\lambda_L = 785\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed Ethane ( $\lambda_L = 785\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed Ethane ( $\lambda_L = 785\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

## 7-AGNR (3 units)

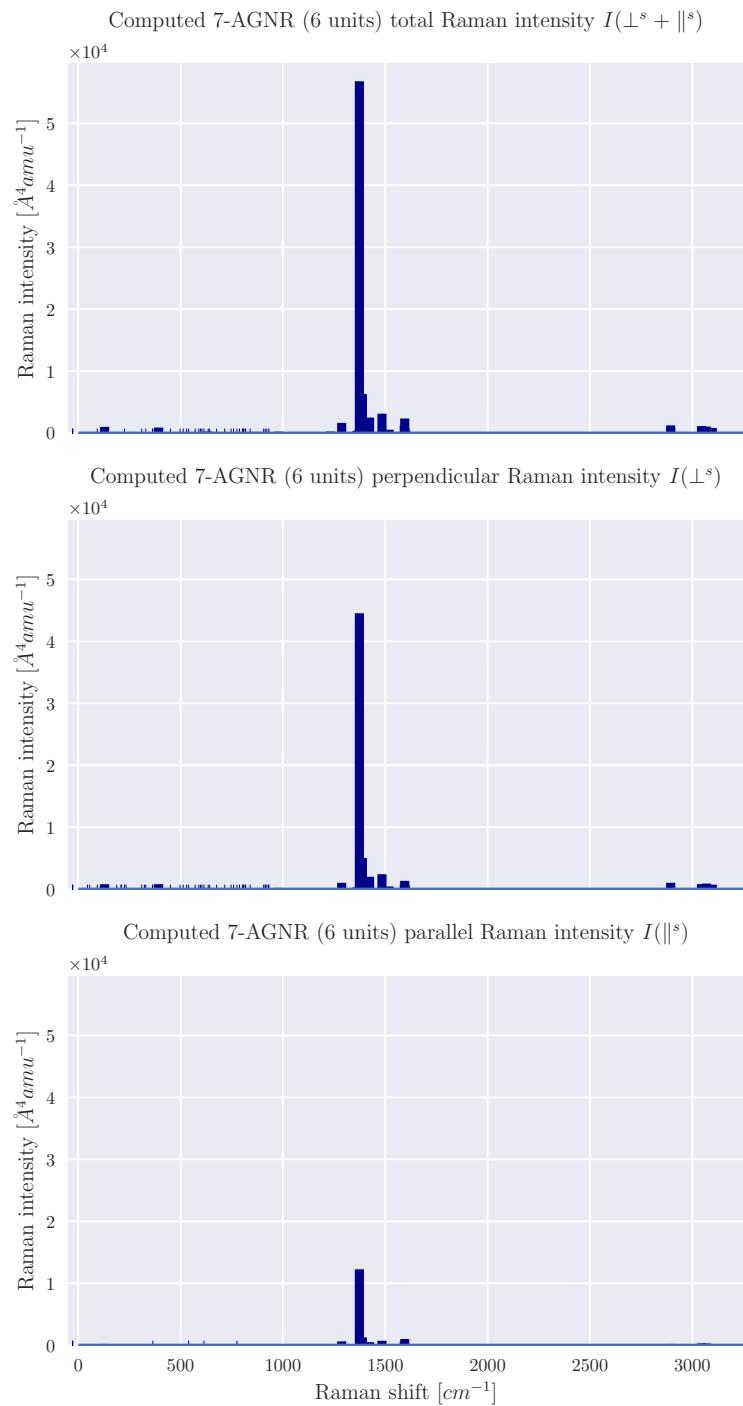


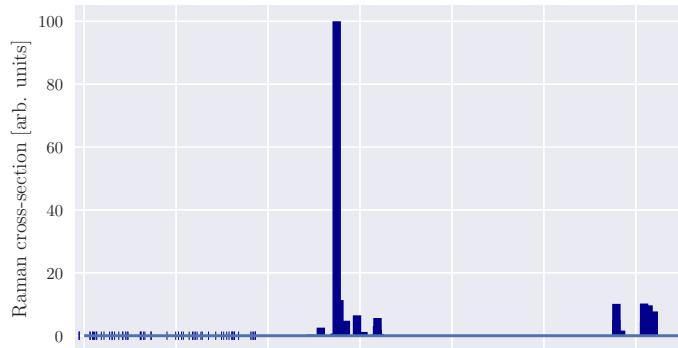
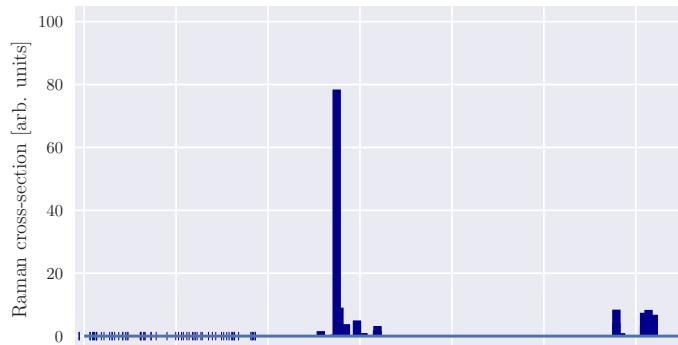
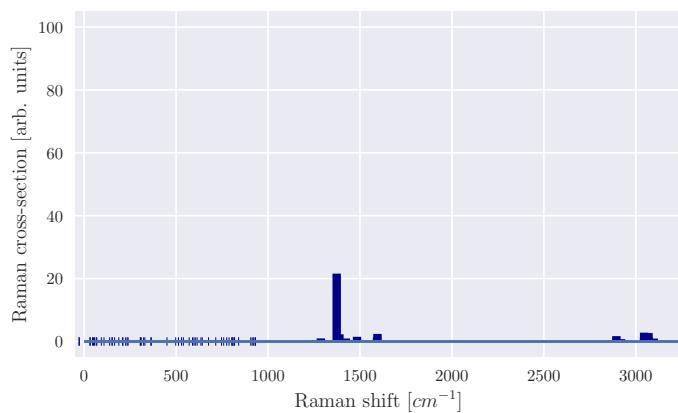
Computed 7-AGNR (3 units) ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (3 units) ( $\lambda_L = 0\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (3 units) ( $\lambda_L = 0\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

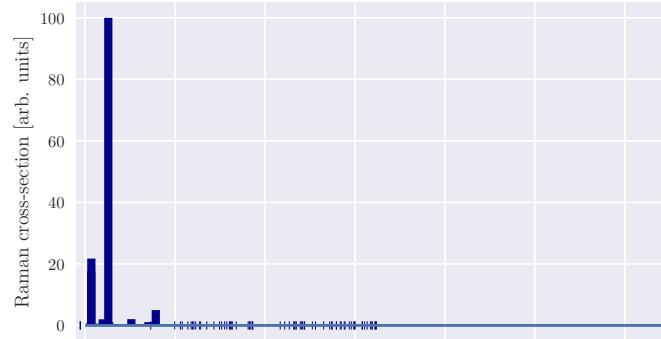
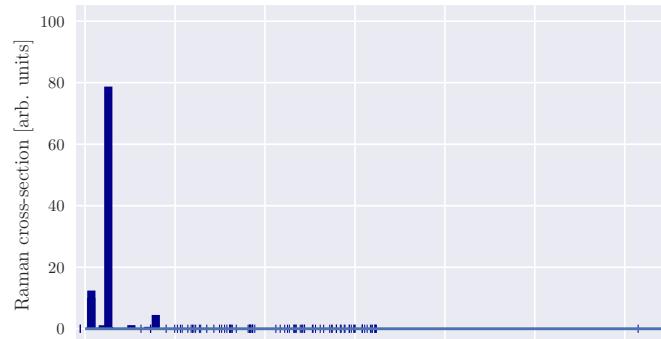
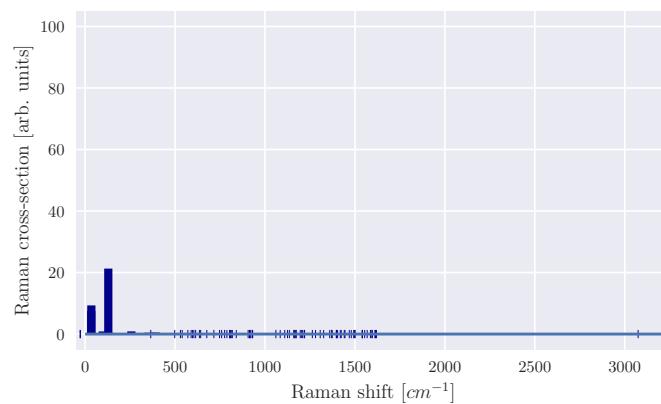
Computed 7-AGNR (3 units) ( $\lambda_L = 532\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (3 units) ( $\lambda_L = 532\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (3 units) ( $\lambda_L = 532\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

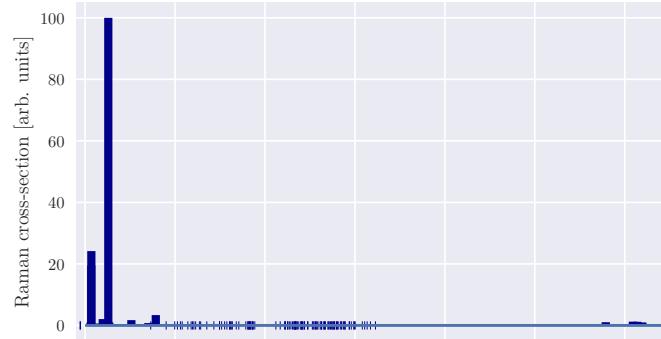
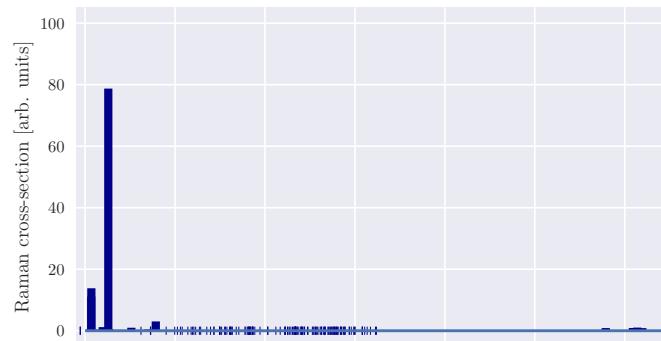
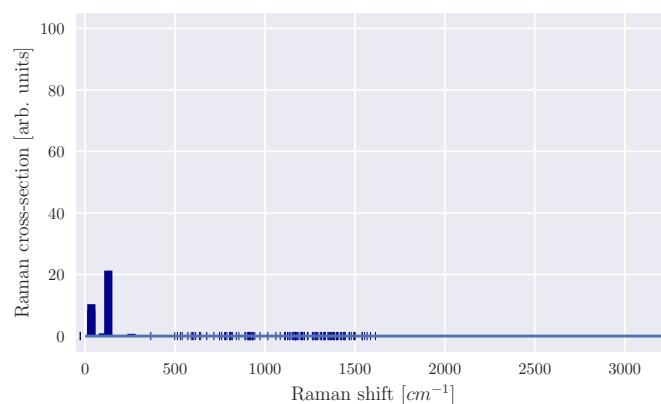
Computed 7-AGNR (3 units) ( $\lambda_L = 785\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (3 units) ( $\lambda_L = 785\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (3 units) ( $\lambda_L = 785\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

## 7-AGNR (6 units)

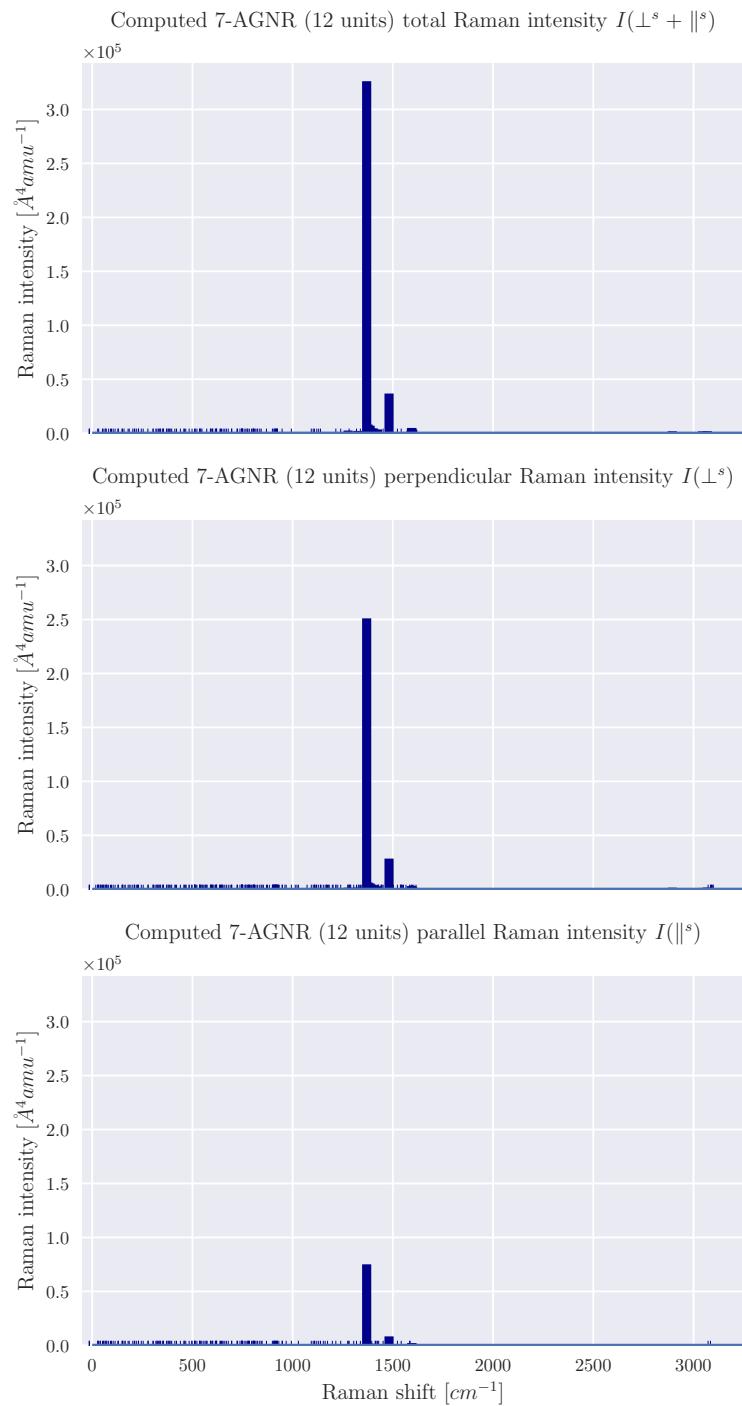


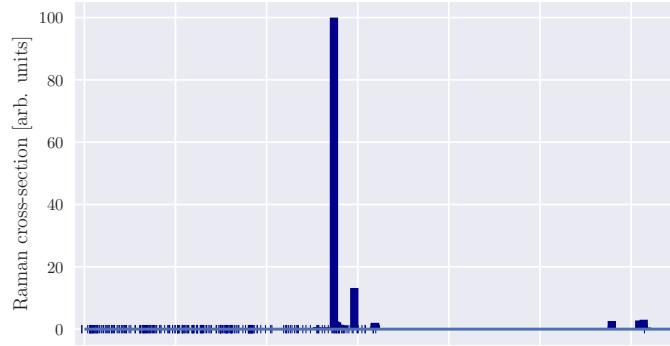
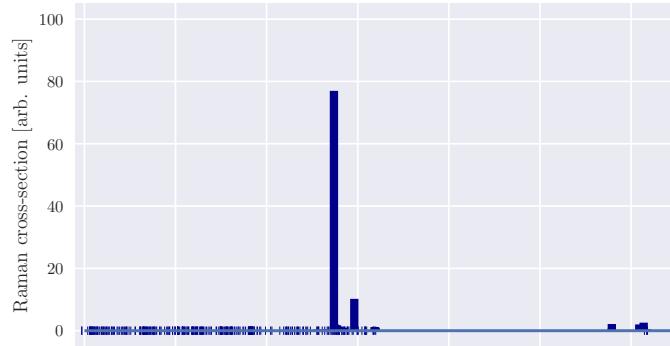
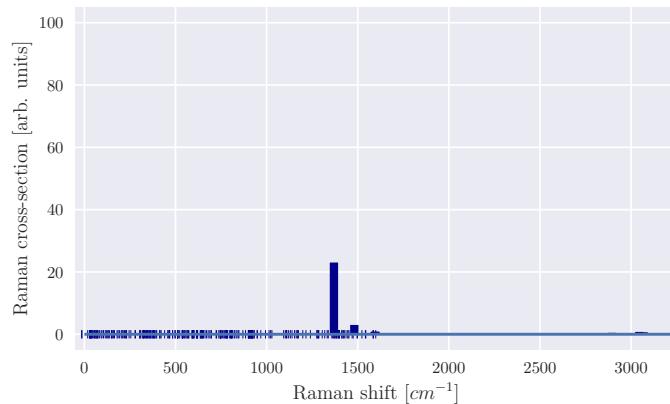
Computed 7-AGNR (6 units) ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (6 units) ( $\lambda_L = 0\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (6 units) ( $\lambda_L = 0\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

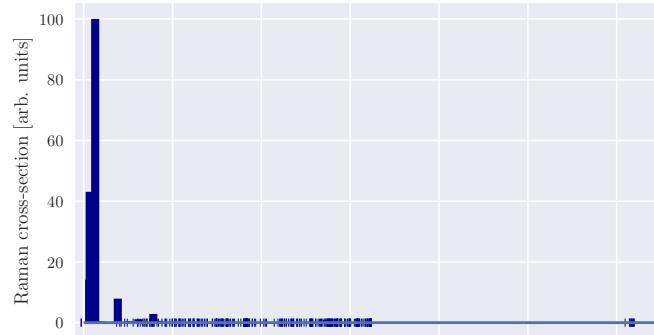
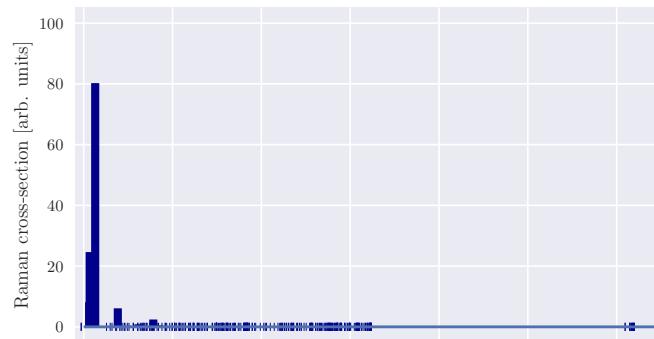
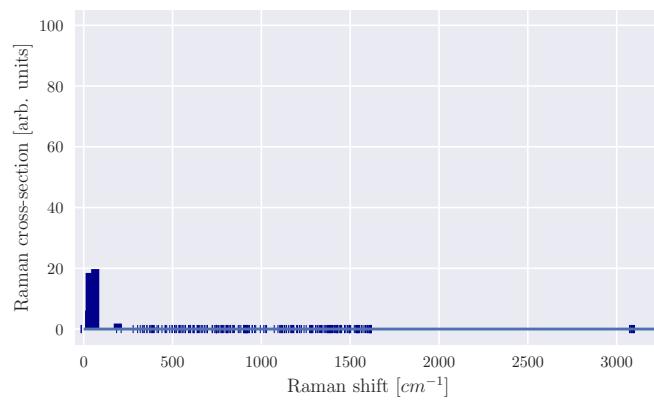
Computed 7-AGNR (6 units) ( $\lambda_L = 532\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (6 units) ( $\lambda_L = 532\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (6 units) ( $\lambda_L = 532\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

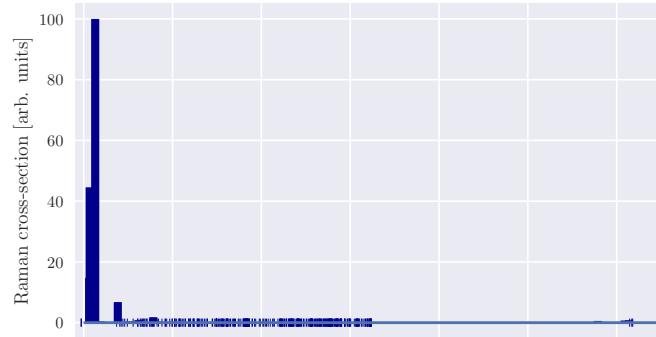
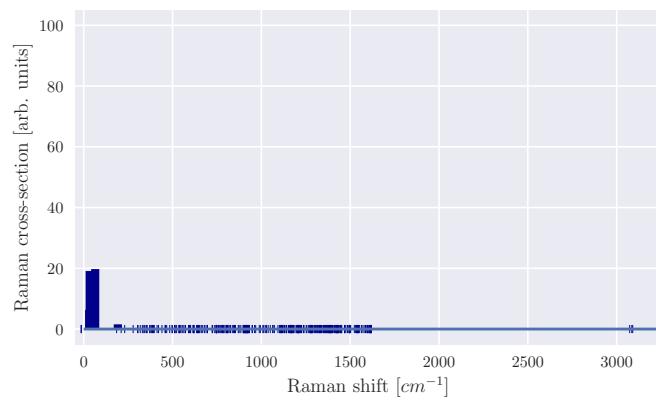
Computed 7-AGNR (6 units) ( $\lambda_L = 785\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (6 units) ( $\lambda_L = 785\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (6 units) ( $\lambda_L = 785\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

## 7-AGNR (12 units)

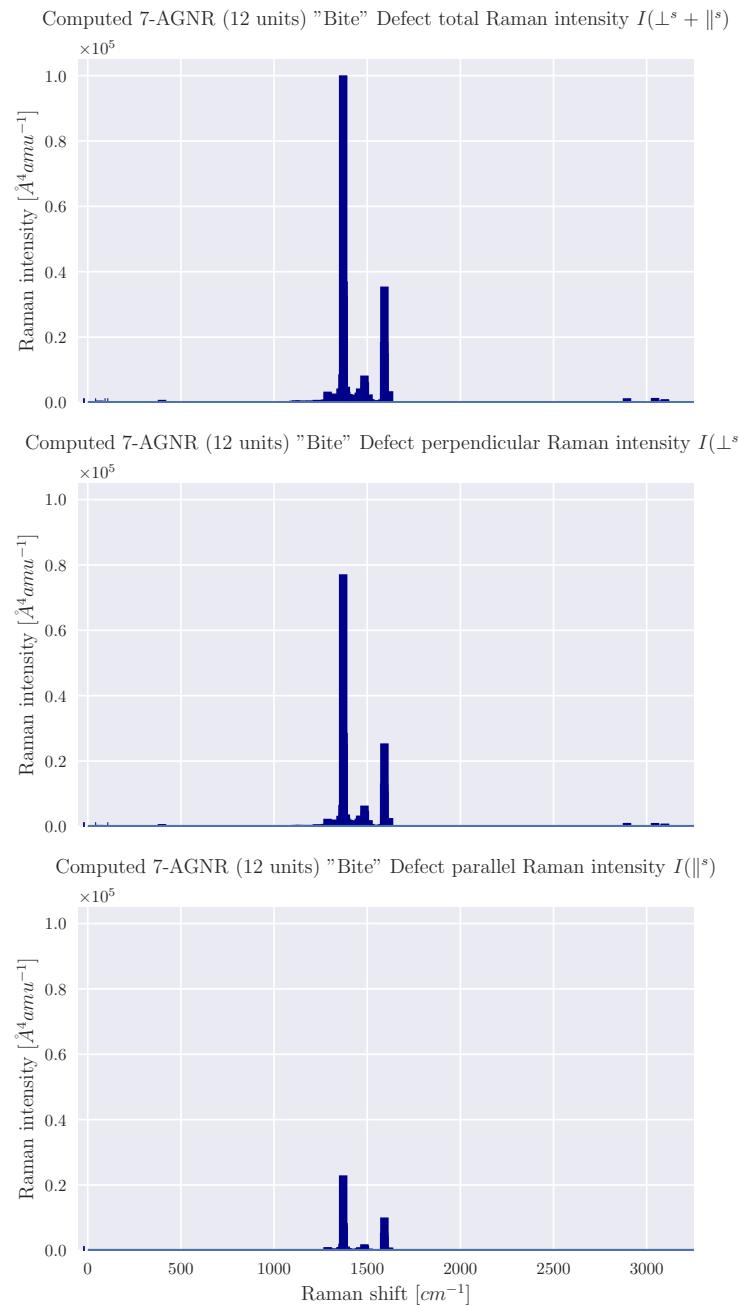


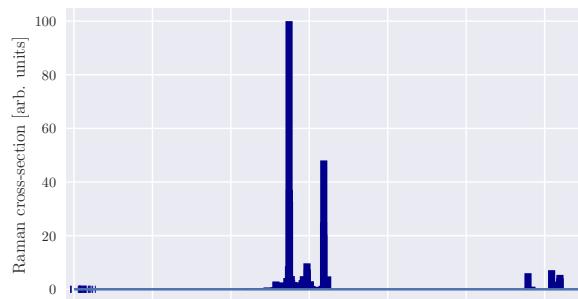
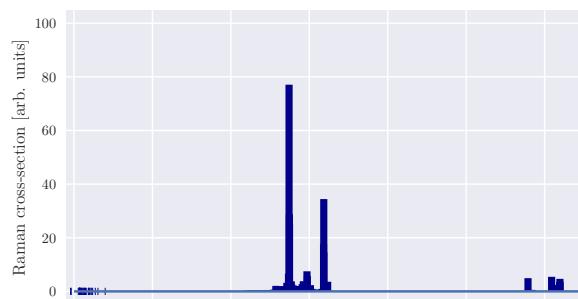
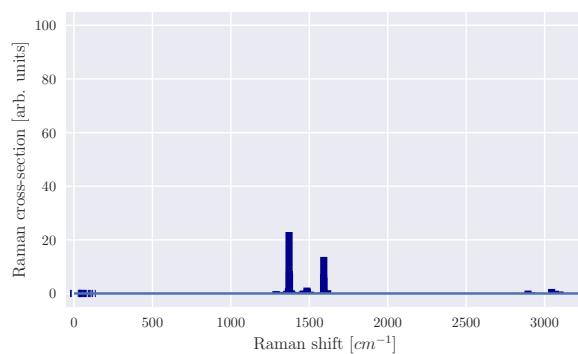
Computed 7-AGNR (12 units) ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) ( $\lambda_L = 0\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (12 units) ( $\lambda_L = 0\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

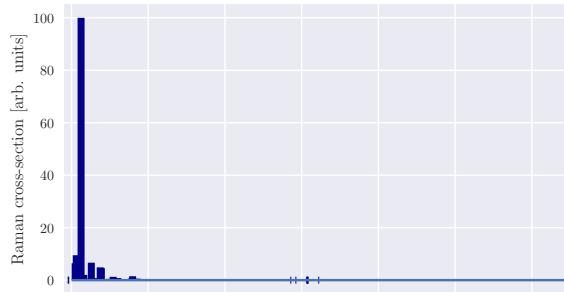
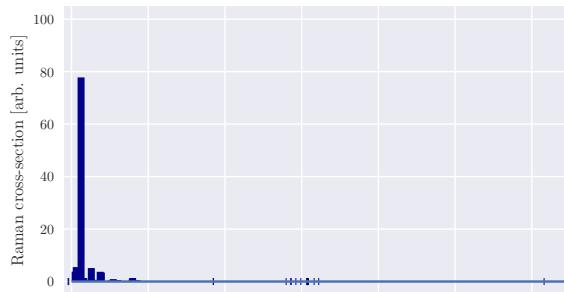
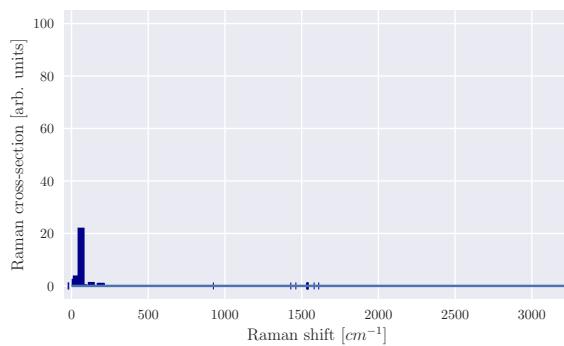
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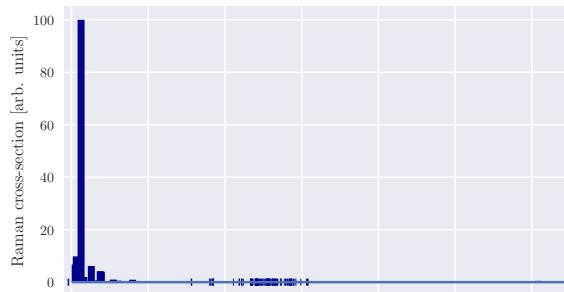
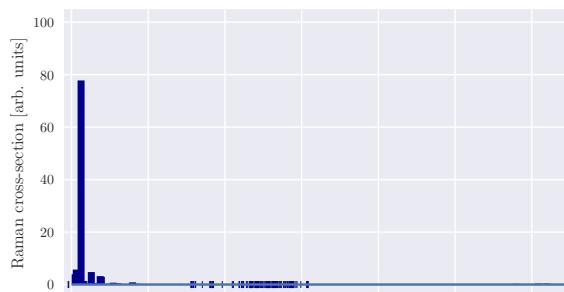
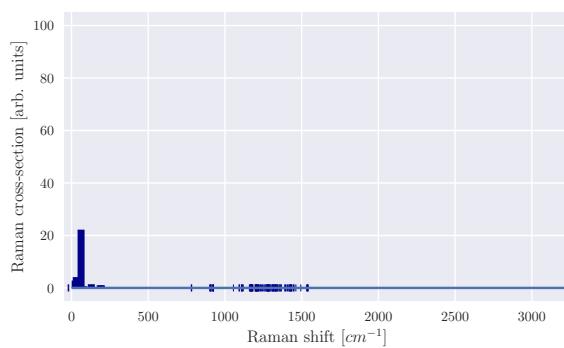
Computed 7-AGNR (12 units) ( $\lambda_L = 785\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) ( $\lambda_L = 785\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (12 units) ( $\lambda_L = 785\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

## 7-AGNR (12 units): "Bite" defect

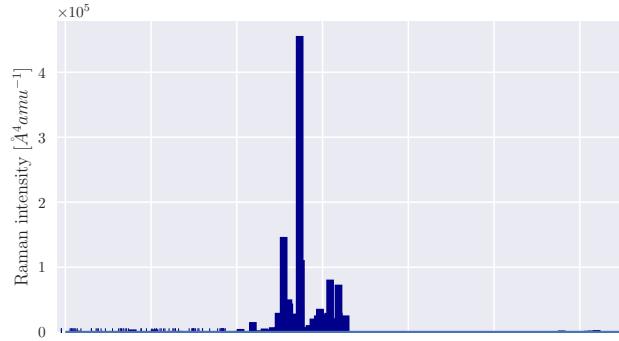
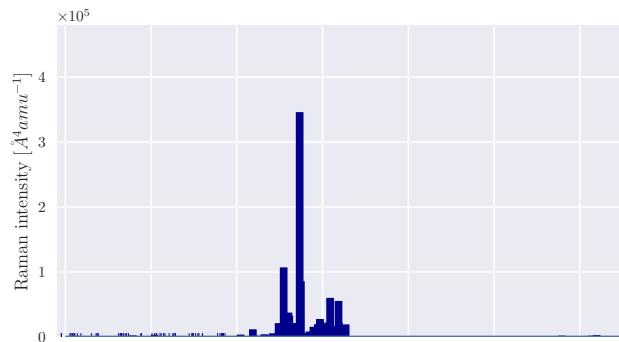
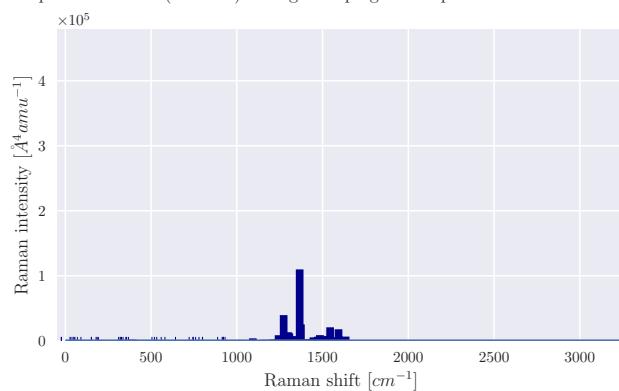


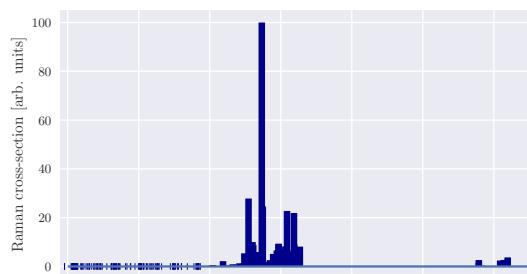
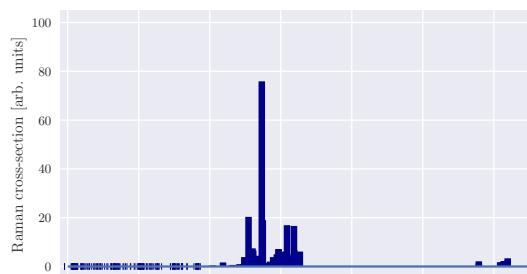
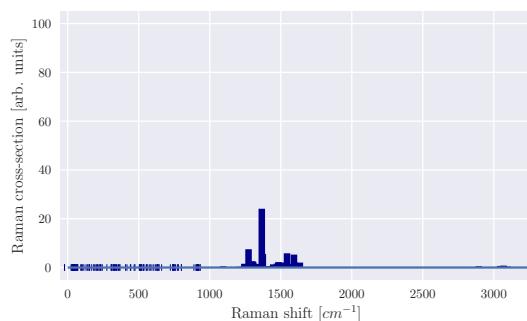
Computed 7-AGNR (12 units) "Bite" Defect ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) "Bite" Defect ( $\lambda_L = 0\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (12 units) "Bite" Defect ( $\lambda_L = 0\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

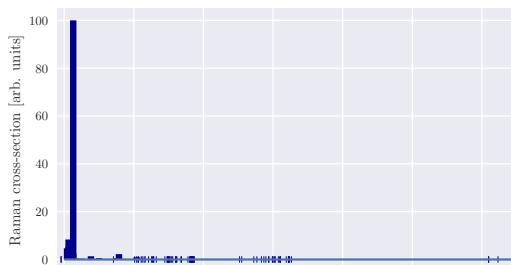
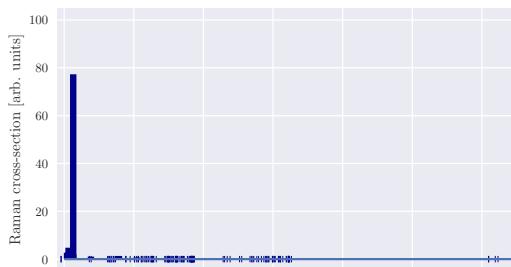
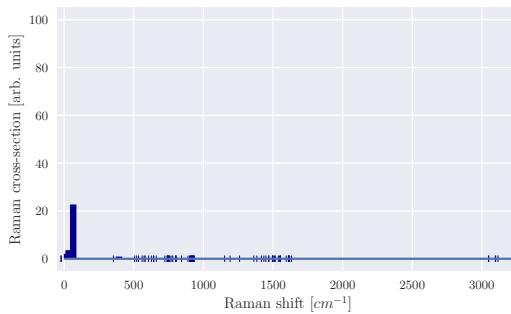
Computed 7-AGNR (12 units) "Bite" Defect ( $\lambda_L = 532\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) "Bite" Defect ( $\lambda_L = 532\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (12 units) "Bite" Defect ( $\lambda_L = 532\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

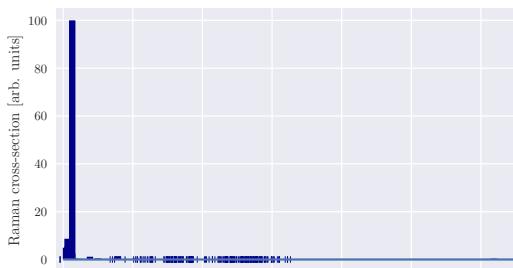
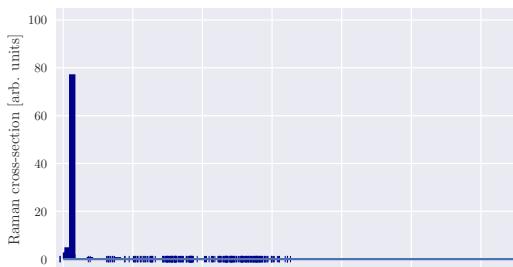
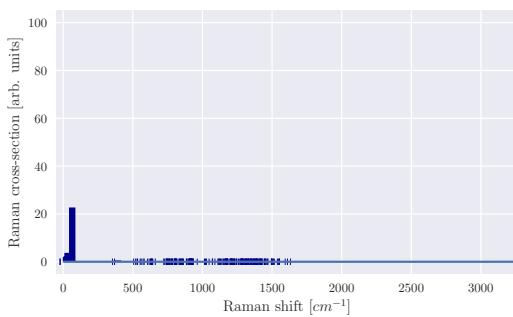
Computed 7-AGNR (12 units) "Bite" Defect ( $\lambda_L = 785\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) "Bite" Defect ( $\lambda_L = 785\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (12 units) "Bite" Defect ( $\lambda_L = 785\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

## 7-AGNR (12 units): Nitrogen doping defect

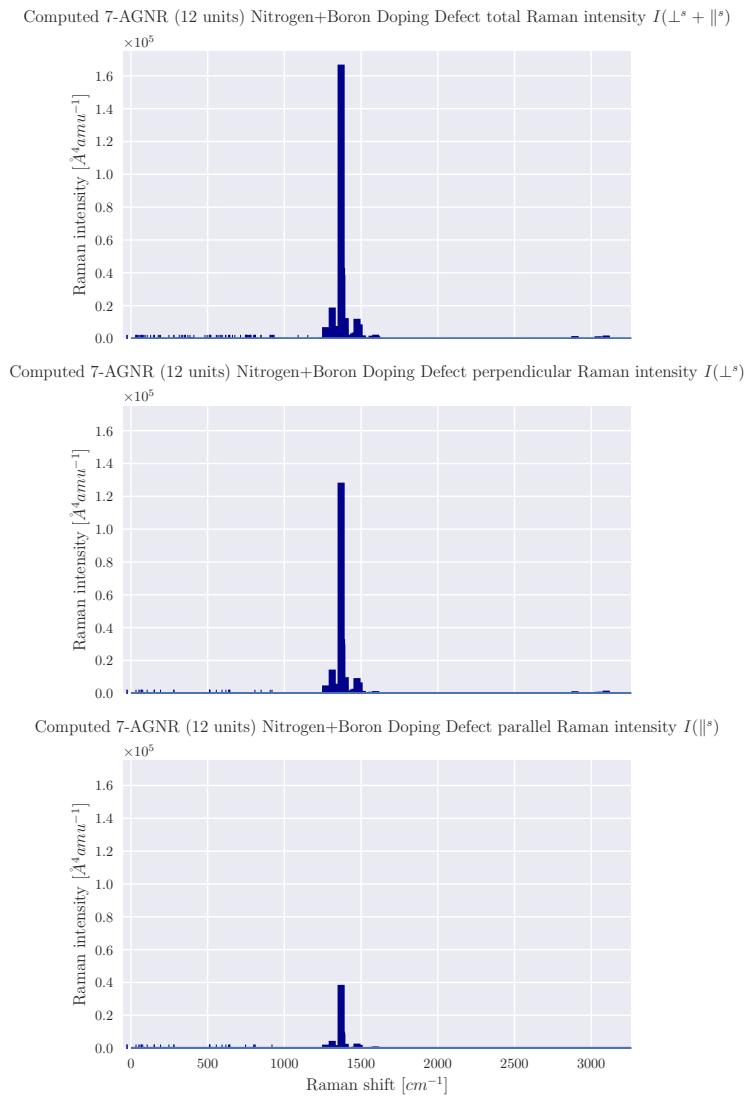
Computed 7-AGNR (12 units) Nitrogen Doping Defect total Raman intensity  $I(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) Nitrogen Doping Defect perpendicular Raman intensity  $I(\perp^s)$ Computed 7-AGNR (12 units) Nitrogen Doping Defect parallel Raman intensity  $I(\parallel^s)$ 

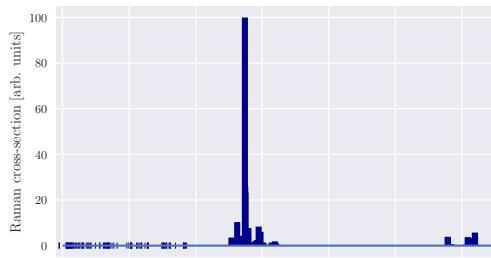
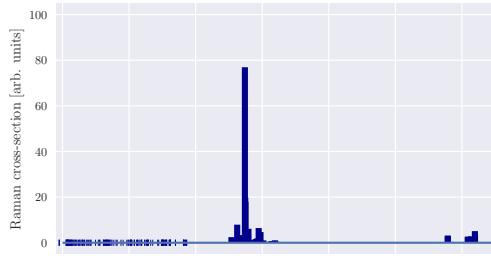
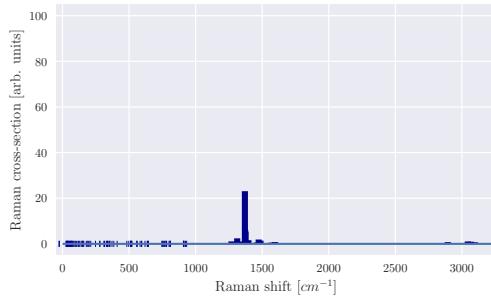
Computed 7-AGNR (12 units) Nitrogen Doping Defect ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^* + \parallel^*)$ Computed 7-AGNR (12 units) Nitrogen Doping Defect ( $\lambda_L = 0\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^*)$ Computed 7-AGNR (12 units) Nitrogen Doping Defect ( $\lambda_L = 0\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^*)$ 

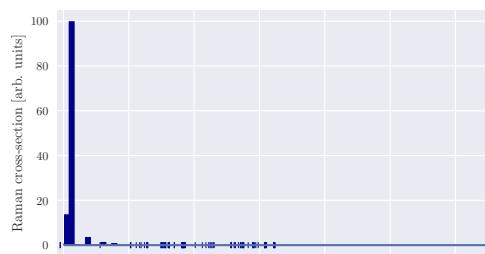
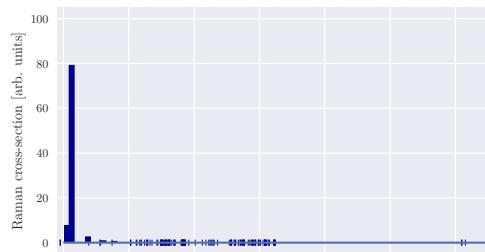
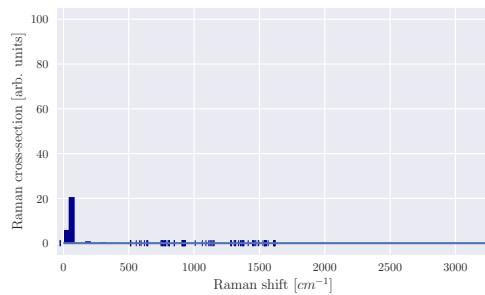
Computed 7-AGNR (12 units) Nitrogen Doping Defect ( $\lambda_L = 532\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) Nitrogen Doping Defect ( $\lambda_L = 532\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (12 units) Nitrogen Doping Defect ( $\lambda_L = 532\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

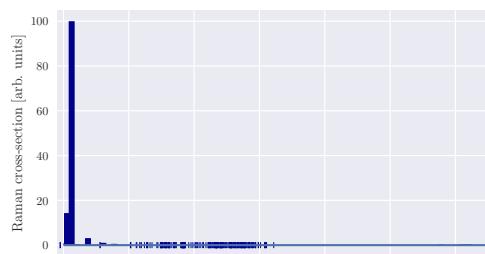
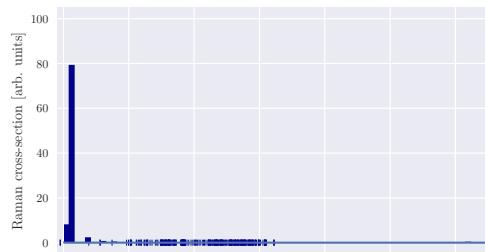
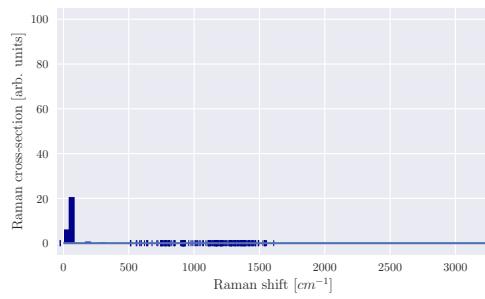
Computed 7-AGNR (12 units) Nitrogen Doping Defect ( $\lambda_L = 785\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) Nitrogen Doping Defect ( $\lambda_L = 785\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (12 units) Nitrogen Doping Defect ( $\lambda_L = 785\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

## 7-AGNR (12 units): Nitrogen and boron doping defect



Computed 7-AGNR (12 units) Nitrogen+Boron Doping Defect ( $\lambda_L = 0\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) Nitrogen+Boron Doping Defect ( $\lambda_L = 0\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (12 units) Nitrogen+Boron Doping Defect ( $\lambda_L = 0\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

Computed 7-AGNR (12 units) Nitrogen+Boron Doping Defect ( $\lambda_L = 532\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^* + \parallel^*)$ Computed 7-AGNR (12 units) Nitrogen+Boron Doping Defect ( $\lambda_L = 532\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^*)$ Computed 7-AGNR (12 units) Nitrogen+Boron Doping Defect ( $\lambda_L = 532\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^*)$ 

Computed 7-AGNR (12 units) Nitrogen+Boron Doping Defect ( $\lambda_L = 785\text{nm}$ ) total Raman cross-section  $\sigma'(\perp^s + \parallel^s)$ Computed 7-AGNR (12 units) Nitrogen+Boron Doping Defect ( $\lambda_L = 785\text{nm}$ ) perpendicular Raman cross-section  $\sigma'(\perp^s)$ Computed 7-AGNR (12 units) Nitrogen+Boron Doping Defect ( $\lambda_L = 785\text{nm}$ ) parallel Raman cross-section  $\sigma'(\parallel^s)$ 

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## Declaration of Originality

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Eidgenössische Technische Hochschule Zürich  
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