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Steve Dave Wansi Wendji, Remi Piotrowski, Carlo Massobrio, Mauro Boero, Christine Tugène, et al.. Enhanced Structural Description of Sodium Vanadium Phosphate Glasses: A Combined Experimental and Molecular Dynamics Study. SSRN: Social Science Research Network, 2024, 10.2139/ssrn.4997219. hal-04802503

## HAL Id: hal-04802503 https://hal.science/hal-04802503v1

Submitted on 25 Nov 2024

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# Enhanced structural description of sodium vanadium phosphate glasses: A combined experimental and molecular dynamics study

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#### Abstract

Structural and bonding insights into sodium vanadium phosphate (NVP) glasses are crucial for optimizing their performance as cathode materials in sodium-ion batteries. This study quantitatively assesses the structural features and bonding characteristics of two NVP glass compositions:  $(Na_2O)_{\alpha}-(V_xOy)_{(1-2\alpha)}-(P_2O_5)_{\alpha}$  ( $\alpha = 0.375$ , 0.285). We combine experimental characterization (differential scanning calorimetry, X-ray diffraction and X-ray photoelectron spectroscopy,) and atomistic modeling (classical molecular dynamics (CMD), and Born-Oppenheimer molecular dynamics (BOMD)). This work provides a quantitative analysis of the different VO<sub>n</sub> units in the two NVP glass models, superseding previous knowledge based largely on CMD simulations. Our results show that the account of the electronic structure, inherent in BOMD simulations is essential for capturing the V-O bonding environment. This includes the splitting of the V-O peak in the pair distribution function due to both short V=O and longer V-O bonds, a higher degree of polymerization in the phosphate network and a more significant role for V<sup>5+</sup> as a network former.

*Keywords:* Sodium vanadium phosphate glasses, X-ray diffraction, X-ray photoelectron spectroscopy, molecular dynamics, Born-Oppenheimer

#### 1. Introduction

The incorporation of alkali ions, such as lithium and sodium, into transition metal oxide (TMO) containing glasses, like vanadium phosphate (VP) and vanadium tellurite (VT) glasses, significantly enhances their functional properties, making these materials highly attractive for solid-state batteries and electrochemical storage devices [1–6]. This is due to their unique combination of properties, including high glass-forming ability, broad vitrification range, low glass transition and melting temperatures, and high thermal expansion coefficients [7–9]. TMO glasses, such as those involving vanadium and iron oxides, are characterized by multi-electron reactions, enhancing energy density performance [5, 7, 8, 10]. Alkali ions in these glasses act as modifiers by disrupting covalent bonds thereby allowing

<sup>1</sup>These authors contributed equally to this work. <sup>2</sup>Corresponding author e-mail: guido.ori@cnrs.fr for mobile charge carriers and increasing ionic conductivity, crucial for energy storage efficiency [11]. While initial studies focused on lithium oxide due to the dominance of lithium-ion batteries [6, 12, 13], there is growing interest in sodium-based systems, such as sodium vanadium phosphate (NVP) glasses, driven by sodium's abundance and lower cost [14–18].

Previous experimental studies on NVP systems have predominantly concentrated on optical, magnetic, electrical, and spectroscopic properties, with limited attention to detailed structural characterization [19–24]. This gap has been partially addressed by classical molecular dynamics (CMD) simulations using empirical potentials, which have been employed to model materials relevant to energy storage applications [25–27], including glasses and glass-ceramics [10, 28–30]. However, CMD struggles to accurately capture local transition metal bonding environments, particularly for vanadium oxides. Advances in high-performance computing, code efficiency, and parallelization now enable the

October 18, 2024

Preprint submitted to J. Non-Cryst. Solids

study of complex glasses and amorphous materials using first-principles molecular dynamics (FPMD) [31– 34], whether through Car-Parrinello (CPMD) [35–37] or Born-Oppenheimer (BOMD) [38] approaches. This has been recently exemplified in our study of a prototypical VP glass, performed by combining CMD with BOMD [38].

Our results for  $50V_xO_y-50P_2O_5$  glass highlighted the local coordination environment of vanadium sites, addressing the controversial presence of four-fold coordinated V<sup>4+</sup> ions. Experimental techniques such as XANES [39–41], as well as NMR and EPR [42], have suggested tetrahedral coordination for V<sup>4+</sup> in certain glass systems. However, studies on crystalline vanadium oxides and amorphous Na<sub>2</sub>O-V<sub>x</sub>O<sub>y</sub>-P<sub>2</sub>O<sub>5</sub> systems indicate that only V<sup>5+</sup> ions adopt tetrahedral coordination [43–47], leaving the coordination state of V<sup>4+</sup> unresolved. In our previous BOMD study on  $50V_xO_y-50P_2O_5$  glass, we clearly demonstrated the absence of V<sup>4+</sup> ions in four-fold coordination, showing the predominance of V<sup>5+</sup> in this configuration, this result being largely in contrast with the CMD models.

In the present work, we extend this combined CMD/BOMD approach to NVP glasses. In particular, we study two  $(Na_2O)_{\alpha} - (V_xO_y)_{(1-2\alpha)} - (P_2O_5)_{\alpha}$ ,  $\alpha =$ 0.375, 0.285 glasses both experimentally and by MD simulations. These glasses are synthesized using meltquenching technique and characterized experimentally through density measurements, X-ray photoelectron spectroscopy (XPS), differential scanning calorimetry (DSC) and X-ray diffraction (XRD). X-ray diffraction, in particular, provided total structure factors and pair correlation functions, which are essential for evaluating the quantitative accuracy of our atomistic models. On the atomic-scale simulation side, we first generated NVP glass models via the melt-quenching approach by CMD, followed by a BOMD refinement to obtain more quantitative insights into the glass structure and properties. Notably, we employed the recently updated BMPshrm potential in our CMD simulations [25, 48, 49], which outperforms other empirical potentials for VP glasses [38]. The further refinement of CMD-derived VP models through BOMD equilibration at 300K allowed capturing the vanadium's local environment by accounting for electronic structure effects not within the reach of CMD calculations.

The paper is organized as follows: Section 2 details the experimental and computational methods. Results are presented in Section 3 for thermal behaviour and Vanadium sites speciation, Section 4 for structure factors, Section 5 for total and partial pair correlation functions, coordination numbers, and structural units, and Section 6 for bond angle distributions,  $Q^n$  distributions and preference ratios. Section 7 presents a detailed analysis of the results, highlighting general remarks and revisiting the structure of NVP glasses with respect to shortand intermediate-range orders. Finally, concluding remarks are presented in Section 8.

#### 2. Experimental and computational methodologies

#### 2.1. NVP glass samples synthesis and characterization

Glasses were prepared using sodium carbonate Na<sub>2</sub>CO<sub>3</sub> (Strem Chemicals, 99.5%), vanadium pentoxide V<sub>2</sub>O<sub>5</sub> (Strem Chemicals, 99.5%), and ammonium phosphate dibasic (NH<sub>4</sub>)<sub>2</sub>HPO<sub>4</sub> (Sigma-Aldrich, 98%) as raw materials. The precursors were weighed in appropriate amounts, mixed in an agate mortar, and heated in a platinum crucible to produce two glass compositions,  $(Na_2O)_{\alpha} - (V_xO_y)_{(1-2\alpha)} - (P_2O_5)_{\alpha}$ , with  $\alpha =$ 0.375 and 0.285. These are referred to as NVP25 and NVP43, respectively, based on the total vanadium content, as shown in Table 1. A preliminary heat treatment at 300°C for 2h was required in order to decompose  $Na_2CO_3$  and  $(NH_4)_2HPO_4$ . The temperature was then slowly raised at the heating rate of 5°C/min from room temperature up to 900°C. The melt was kept at this temperature for 1h with a homogenization each 15 min. Finally, the melt was quenched at room temperature between two stainless steel plates to get glass sample. Density was measured on the glass powder using helium pycnometer (Micromeritics AccuPyc II 1340) in a 1  $\text{cm}^3$  cell. The thermal properties of the two glasses were determined using differential scanning calorimetry (DSC, model TA Instrument AQ20) from 40° to 550°C at 10 °C/min, allowing to determine the glass transition and crystallization onset temperatures ( $T_g$  and  $T_c$ , respectively), together with the thermal stability that is defined according to the Dietzel criterion as  $\Delta T = T_c - T_g$ . XPS measurements to determine the speciation of V sites were performed using a Kratos Axis Ultra DLD spectrometer with a monochromatic Al K $\alpha$  source (12 mA, 15 kV). The working function of the instrument was calibrated to give a binding energy of the metallic gold Au  $4f_{5/2}$  of 84.0 eV, and the dispersion was adjusted to give a binding energy of metallic copper Cu 2p<sub>3/2</sub> at 932.6 eV. The Kratos charge neutralization system was used for each analysis, and still completed so as to set the V 2p<sub>3/2</sub>  $(V^{5+})$  signal at 517.2 eV. The pressure in the analysis chamber was around  $5 \times 10^{-9}$  Torr. Survey spectra were obtained over an analysis area of approximately 700x300  $\mu$ m and a resolution of 160 eV (Pass Energy).

Table 1: Glass composition and V<sup>4+</sup> content of the two NVP synthesized and simulated models by CMD and BOMD.

Systems		Na <sub>2</sub> O	$V_x O_y [V_2 O_4 + V_2 O_5]$	$P_2O_5$	V <sup>4+</sup>
		(%)	(%)	(%)	(%)
NVP25	Exp.	37.50	25.00 [1.25 + 23.75]	37.50	5.0 <sup>b</sup>
	CMD	37.50	25.00 [2.78 + 22.22]	37.50	11.1
	BOMD	37.5	25.00 [2.78 + 22.22] <sup>c</sup>	37.5	11.1 <sup>c</sup>
NVP43	Exp.	28.50	43.00 [5.59 + 37.41]	28.50	13.0 <sup>b</sup>
	CMD	28.57	42.86 [6.43 + 36.43]	28.57	16.7
	BOMD	28.57	42.86 [7.86 + 35.00] <sup>c</sup>	28.57	18.3 <sup>c</sup>

<sup>b</sup>Estimated by XPS measurements.

<sup>c</sup>Estimated by spin topology analysis at PBE0 level from configurations sampled from BOMD trajectory.

Table 2: Density (*d*), glass transition  $(T_g)$  and crystallization onset temperature  $(T_c)$  of synthesized NVP25 and NVP43 glasses.

	.,			8
Systems	da	$T_g^b$	T <sub>c</sub> <sup>b</sup>	$\Delta T_{T_c-T_g}$
	$(g/cm^3)$	(°Č)	(°C)	(°C)
NVP25	2.807	327	436	109
NVP43	2.939	297	377	80

<sup>a</sup>Estimated by He pycnometer measurements. <sup>b</sup>Estimated by DSC measurements.

High Resolution spectra were obtained over the same analysis area at a resolution of 20 eV (Pass Energy). The spectra were analyzed using CasaXPS software [50] (v. 2.3.25) with curves generally mixing 70% Gaussian and 30% Lorentzian, and Shirley mode for inelastic electron background subtraction.

The experimental total X-ray structure factor S(k) and reduced total pair distribution functions G(r) of our NVPs systems were determined through X-ray total scattering following procedures similar to those employed in [51]. X-ray scattering measurements were conducted at room temperature using a specialized laboratory setup based on a Bruker D8 Advance diffractometer. This instrument was equipped with a silver sealed tube ( $\lambda = 0.559422$  Å) and a rapid LynxEye XE-T detector. Modifications were made to this setup to maximize the collected intensities, minimize spurious signals from the empty environment, and achieve good counting statistics up to a large scattering vector length of 21.8 Å<sup>-1</sup>. Approximately 20 mg of each sample's powder were placed in a thin-walled (0.01 mm) borosilicate glass capillary with a diameter of about 0.7 mm to limit absorption effects. The  $\mu R$  values (where R is the capillary radius and  $\mu$  is the sample's linear attenuation coefficient) were estimated based on precise measurements of the mass and dimensions of the samples, yielding values of 0.17 and 0.22 for NVP25 and NVP43 glasses, respectively.

After sealing, the capillary was mounted on a goniometric head and aligned so that its axis coincided with the diffractometer's goniometer axis. Data acquisition involved multiple scans over the 0-152°, 50-152°, and 100–152°  $2\theta$  ranges with a step size of 0.01°. These scans were then merged, resulting in a total equivalent acquisition time of approximately 50 hours per sample. The raw data were corrected, normalized, and Fourier transformed using custom software [52] to obtain the reduced atomic pair distribution functions G(r). Corrections accounted for capillary contributions, empty environment, Compton and multiple scatterings, absorption, and polarization effects. The necessary X-ray mass attenuation coefficients, atomic scattering factors, and Compton scattering functions for data correction and normalization were calculated from tabulated data provided by the DABAX database [53]. Absorption corrections were evaluated using a numerical midpoint integration method, where the sample cross-section was divided into small subdomains, following a method similar to that proposed by A. K. Soper and P. A. Egelstaf [54]. The normalization constant was determined using the high-angle method, ensuring that the coherently scattered intensity oscillated weakly around the sample's average atomic scattering factor at high scattering vector lengths (from  $k_{max}/2$  to  $k_{max}$ ).

#### 2.2. CMD and BOMD simulations details

The computational procedure employed in the previous work [38] was adopted, consisting of a full CMD thermal cycle followed by a final equilibration by means of BOMD at 300 K. We employed BMP-shrm (detail in the SI) developed by Bertani *et al.* [48] based on the original parameters developed for V<sup>5+</sup> and V<sup>4+</sup> by Ori *et al.* [25] and Pedone *et al.* [55] together with the V–O–V and V–O–P three-body parameters recently reported by Malavasi *et al.* [49]. This choice of potential parameters was intended to exploit the best force field among the three tested previously [38]. Three replicas of NVP25 and NVP43 with chemical compositions detailed in Table 1 were generated randomly and placed in a cubic cell with dimensions adjusted to match the reference densities values (see Table 2). In our CMD simulations, the short-range interactions were truncated at a distance of 7.0 Å and the long-range interactions were calculated using the Ewald summation method with a precision of  $10^{-5}$  eV, up to a cutoff distance of 8.5 Å. The velocity Verlet algorithm was employed with a time step of 1 fs to integrate the equation of motion. The NVP glasses models were obtained by melt-quenching thermal procedure [38] with the Nosé-Hoover thermostat [56-58] used to control the temperature. First, the initial structures were relaxed at 300 K in the NVT ensemble. Each system was heated to 4000 K and kept for 150 ps at this temperature followed by the cooling from 4000 K to 300 K with a constant rate of 2.5 K/ps. The relevant properties are averaged over the structures obtained from the final 150 ps of a 300 ps trajectory at 300 K across different replicas. BOMD calculations for these two glasses were performed at 300 K after the CMD dynamics. BOMD calculations for these two glasses were performed at 300 K after the CMD dynamics. BOMD simulations were performed using the Born-Oppenheimer scheme, with atom-centered Gaussiantype basis functions to describe the orbitals, and an auxiliary plane-wave basis set to re-expand the electron density. We employed double- $\zeta$  polarized MOLOPT basis sets [59] for V, P, and O, and used a cutoff energy of 800 Ry for the plane waves at the  $\Gamma$  point only. Using the CMD-derived structures as a starting point, we performed a BOMD simulation at 300 K for approximately 5 ps using Goedecker-Teter-Hutter pseudopotentials to describe core-valence interactions [60] together with the semilocal Perdew-Burke-Ernzerhof (PBE) [61, 62] exchange-correlation functional within a spin unrestricted DFT formalism. A final optimization of the electronic structure was obtained employing PBE0 hybrid functional [63] containing 25 % nonlocal Hartree-Fock exchange, with a cutoff energy of 800 Ry. For the BOMD analysis, the last 3 ps of the trajectories were used and the results averaged over the three replicas. Final optimization using the PBE0 hybrid functional yields a more accurate representation of the electronic structure, energy bandgap, and spin topology [64], consistent with prior electronic analyses [38]. The CMD simulations were performed using the DL-POLY code (version 4.10.0) [65], while the BOMD simulations utilized the CP2K package [66] with the DZVP-MOLOPT-SR-GTH basis set [67].

#### 3. Characteristic temperatures, thermal stability and Vanadium sites speciation

The experimental and simulated chemical compositions of the two NVP glasses are reported in (Table 1). The densities of the synthesized glasses, NVP25 and NVP43, are 2.807 and 2.939 g/cm<sup>3</sup>, respectively (Table 2). These values indicate that NVP43 has a greater mass per unit volume, likely due to its higher vanadium oxide content at the expense of sodium oxide. The DSC thermograms of the two synthesized glasses are presented in Figure 1. DSC thermograms illustrate the thermal behavior of the two glass compositions, while Table 2 lists the characteristic temperature values obtained. NVP25 exhibits a higher glass transition tem-



Figure 1: DSC plots of NVP25 (top) and NVP43 (bottom) glass powder showing glass transition temperature ( $T_g$ ) and the crystallization onset ( $T_c$ ).

perature ( $T_g$ ) of ~327°C compared to NVP43 (~297°C), indicating a more rigid structure, likely due to its higher phosphate content. Phosphorus, being a stronger network former than vanadium, contributes to a more interconnected and rigid glass network. In contrast, NVP43, with a higher vanadium content, forms a less rigid structure. Although NVP25 likely contains more sodium, which typically increases flexibility, its higher  $T_g$  emphasizes the dominant role of phosphorus in enhancing network stiffness. This is consistent with the even higher  $T_g$  of ~397°C in VP50 glass, further supporting the role of phosphorus [68]. NVP25 also shows a higher crystallization temperature ( $T_c$ ) of ~436°C compared to NVP43 (~377°C), indicating greater thermal stability, with a larger  $\Delta T=T_c-T_g = (109°C vs 80°C)$ . The lower crystallization intensity in NVP25 suggests reduced or less extensive crystallization, aligning with its increased stability. In contrast, NVP43 exhibits a more pronounced crystallization due to its higher vanadium content. Overall, the higher  $T_g$  and  $T_c$  of NVP25 reflect a more thermally stable and rigid structure, while NVP43 shows increased flexibility and crystallization.

The presence of a mixed valence for the vanadium (speciation of vanadium sites) in the synthesized NVP25 and NVP43 glasses was assessed in the synthesized samples using XPS measurements. Figure 2 (Left) presents the XPS spectra of the O 1s and V 2p core levels for each sample. These spectra exhibit three distinct features: (1) O 1s core level at about 531 eV; (2) V  $2p_{3/2}$ at about 517.2 eV; and (3) V  $2p_{1/2}$  core level states at about 524 eV [69]. Deconvolution of the V  $2p_{3/2}$  and V  $2p_{1/2}$  signals enables quantification of the relative content of V in different oxidation states, as reported in Table 1. XPS analysis indicates that vanadium exists primarily in the +5 oxidation state in both investigated glasses, with a distinct presence of vanadium in the +4 oxidation state. Specifically, NVP25 and NVP43 show  $V^{5+}$ : $V^{4+}$  ratios of 95:5% and 87:13%, respectively. The presence of vanadium in other oxidation states, while not entirely ruled out, is minimal and negligible.

The V speciation is approached differently in CMD and BOMD simulations. In CMD, V speciation is predetermined by assigning potential parameters corresponding to  $V^{5+}$  and  $V^{4+}$  oxidation states [25, 48]. In BOMD the initial configuration specifies only the total number of V sites, while the final distribution is determined by analyzing the local V site spin topology of the converged ground-state energy configuration using PBE0 hybrid functional calculations, following a procedure validated for VP50 glass [38]. Converged spin localization at V sites enabled a classification based on the oxidation states in BOMD simulations. As previously reported for VP50 glass, PBE0-level calculations were necessary to obtain a well-defined spin distribution, facilitating clear distinction between V<sup>5+</sup> ( $\sigma_{spin} \sim 0$ ) and V<sup>4+</sup> ( $\sigma_{\rm spin}$  ~1) sites, as shown in Figure 2 (Right). Based on these  $\sigma_{\rm spin}$  values, BOMD calculations gives chemical compositions (in mol%) corresponding to  $37.5Na_2O - 25.0V_xO_y[22.2V_2O_5 + 2.8V_2O_4]$ -  $37.5P_2O_5$  and  $28.5Na_2O$  -  $43.0V_xO_y[35.8V_2O_5 +$   $7.2V_2O_4$ ] - 28.5P<sub>2</sub>O<sub>5</sub> for NVP25 and NVP43. Despite a slight increase in V<sup>4+</sup> content compared to the experimental data, the BOMD V distribution aligns well with the experimental compositions. Notably, NVP43 exhibits a higher content of V<sup>4+</sup> than NVP25 (see Table 1). Electronic density of states calculations using the PBE0 hybrid functional resulted in open bandgap values of  $1.53\pm0.39$  eV for the NVP25 model and  $1.94\pm0.33$  eV for the NVP43 model. These values are consistent with previous findings for VP50 [38], identifying the two NVP models as semiconducting glasses with large bandgaps, although slightly smaller than the 2.4–2.8 eV range observed for VP50 glass.

#### 4. Reciprocal space properties: X-ray Total Structure Factors

Figure 3 shows the reciprocal space X-ray total structure factors for the NVP25 and NVP43 glasses. The patterns discernible in the plots reflects not only the distinct peaks but also the presence of a degree of intermediaterange order, as indicated by a small shoulder around ~1  $Å^{-1}$  that was not observed in the VP50 glass [38]. This feature implies additional structural features deserving further exploration through computational methods. The X-ray scattering technique is found to be more sensitive to the local arrangement of vanadium sites compared to neutron scattering [38]. The BOMD simulations align closely with the experimental data in terms of peak positions and intensities, demonstrating their effectiveness in accurately capturing the glass structures of NVP. In contrast, CMD simulations exhibit a significant overestimation of the first peak intensity and a pronounced peak at approximately  $\sim 2 \text{ Å}^{-1}$ . BOMD, on the other hand, shows less sharp peaks that are more in line with the experimental data, although both methods underdescribe the shoulder at  $\sim 1$  Å<sup>-1</sup>, which is a signature of intermediate-range order, with BOMD performing slightly better in this regard. These disparities emphasize the inherent limitations of the CMD methodology, particularly its struggle to quantitatively model the short- and intermediate-range order of vanadiumcontaining glasses, which is critical for understanding the local environment of vanadium sites. The differences between CMD and BOMD results diminish at higher k values (beyond approximately  $4 \text{ Å}^{-1}$ ). This supports the idea that CMD can serve as a useful tool for preliminary structural modeling, while the consideration of BOMD approaches is essential to obtain more accurate and reliable structural descriptions of complex oxide glasses like NVP25 and NVP43. This statement is



Figure 2: (Color online) Left: XPS spectra of NVP25 (top) and NVP43 (bottom) glasses in the O 1s and V 2p regions, revealing the presence of  $V^{5+}$  and  $V^{4+}$  oxidation states. Right: Spin densities distributions of V sites calculated at the PBE0 level ( $\rho_{spin}$ , in *e* units) for both NVP25 (top) and NVP43 (bottom) glass models by BOMD. Inset: Averaged values of the energy bandgap (in eV) calculated at the PBE0 level for both for both NVP25 and NVP43 glass models. Bandgap values for both spin-up and spin-down states are averaged over three configurations simulated for each system.



Figure 3: (Color online) X-ray total structure factors for NVP25 and NVP43 glasses, comparing CMD, BOMD, and experimental data.

further reinforced by the analysis of the  $R_{\chi}^{S(k)}$  values [70] as defined by Eq. (1) and presented in Table 3.

$$R_{\chi} = 100 \times \left(\frac{\sum_{i} \left[\operatorname{Exp}^{(i)} - \operatorname{Sim}^{(i)}\right]^{2}}{\sum_{i} \left[\operatorname{Exp}^{(i)}\right]^{2}}\right)^{1/2}, \qquad (1)$$

 $R_{\chi}^{S(k)}$  quantifies the level of agreement of the theoretical prediction with the experimental data, reminding that a

lower  $R_{\chi}^{S(k)}$  values indicate a better agreement. BOMD yields  $R_{\chi}^{S(k)}$  values of  $(10.1\pm0.9)\%$  for NVP25 and (9.8±1.2)% for NVP43, whereas CMD results in significantly higher values of  $(14.4\pm0.2)\%$  and  $(17.1\pm1.0)\%$ , respectively (see Table 3, first row). The improved agreement with experimental data achieved by refining the CMD simulation with an equilibration at 300 K through BOMD is consistent with findings for VP50 glass reported in previous studies [38]. When comparing NVP25 and NVP43, notable differences in their structural features emerge. Although NVP25 contains a higher sodium oxide content, which typically suggests a more disordered structure, the peaks for NVP43 are more broadened. This indicates that NVP43 has a more complex structural environment, likely resulting from its higher vanadium content, which contributes to greater disorder within the glass structure.

#### 5. Real space properties

#### 5.1. Total pair distribution function

Figure 4 presents a comparative analysis of the reduced total X-ray pair distribution function G(r) for NVP25 and NVP43 glasses. The experimental data, which exhibits greater complexity than those of the VP50 glass [38, 71] due in part to additional Na-O interactions, are compared with results from CMD and BOMD simulations. The experimental G(r) was derived via Fourier transform of the total structure factors, as outlined in Eq. (2).

$$G(r) = \frac{2}{\pi} \int_0^{k_{\max}} k \left[ S(k) - 1 \right] \sin(kr) \, dk \tag{2}$$

This allows for direct comparison with our calculated results for the NVP25 and NVP43 glasses (Eq. (3)).

$$G(r) = 4\pi r \rho \left[ g_{\text{tot}}(r) - 1 \right], \qquad (3)$$

where  $\rho$  is the number density and  $g_{tot}(r)$  is the unitless total pair correlation function  $(g_{tot}(r) \rightarrow 1 \text{ for}$  $r \rightarrow \infty$ ). The positions of the first four peaks' maxima in the 1-4 Å interval are summarized in Table 4, comparing CMD and BOMD values with experimental data. The analysis reveals significant discrepancies between CMD predictions and experimental measurements, while BOMD results demonstrate markedly improved agreement across the examined r range. In the short-range order region (1–3 Å), BOMD simulations accurately capture the experimental features for both glass compositions. The first peak, centered at approximately 1.5-1.6 Å, attributed to P–O and V=O bonds, is well-reproduced by BOMD in terms of position, intensity, and shape. In contrast, CMD simulations consistently overestimate this peak's intensity by about 20-30%, indicating a greater degree of short-range overstructuring, particularly pronounced for NVP43. Both CMD and BOMD shift the experimentally observed peak at about 1.96 Å to lower values of around 1.8 Å. Beyond the short-range order (3–5 Å), CMD shows a consistent shift of approximately 0.5 Å toward larger r values compared to experimental data for both NVP25 and NVP43, indicating systematic errors in predicting second-neighbor distances. Conversely, BOMD results closely align with experimental peak positions, with deviations typically under 0.1 Å (Table 4). BOMD also better reproduces peak shapes and relative intensities more accurately in the 2-4 Å range, while CMD predicts shifted sharper, more intense peaks, particularly overestimating and right-shifting the fourth peak by up to 20-30% and 0.3 Å for both NVP models. The superior performance of BOMD in reproducing the experimental G(r) underscores the critical role of explicitly accounting for electronic structure effects in modeling sodium vanadium phosphate glasses. Furthermore, the limitations of the CMD method are emphasized by the  $(R_{\chi}^{G(r)})$  parameter values calculated within the 1–4 Å range (Table 3, second row). CMD consistently yields significantly higher  $R_{\chi}^{G(r)}$  values compared to BOMD, indicating poorer agreement with experimental data.

For instance, the NVP43 system exhibits an  $R_{\chi}^{G(r)}$  of 96.2 ± 3.1% for CMD versus 65 ± 4.8% for BOMD, partially due to the observed shift between experimental and calculated second and 4th peak's positions. This comparative analysis demonstrates that BOMD simulations provide a more accurate structural description of NVP25 and NVP43 glasses compared to CMD, particularly in the short and medium-range order regions significantly affecting the glasses' physical and chemical properties.



Figure 4: (Color online) Reduced total pair distribution function G(r) for NVP25 and NVP43 glasses, illustrating the comparison between the calculated data (CMD and BOMD) and the experimental data in the range 1–4 Å range.

Table 3: Comparison of the agreement between CMD, and BOMD simulations and experimental data using goodness-of-fit  $R_{\chi}$  parameters for X-ray total structure factor S(k) and reduced pair distribution function G(r) of NVP25 and NVP43 glasses at 300 K.

	NV	P25	NVP43		
X-rays	CMD	BOMD	CMD	BOMD	
$R_{\chi}^{S(k)}$	$14.4\pm0.2$	$10.1 \pm 0.9$	$17.1 \pm 1.0$	$9.8 \pm 1.2$	
$R_{\chi}^{G(r)}$	$87.3 \pm 2.3$	$62.9\pm2.0$	$96.2 \pm 3.1$	$65.0 \pm 4.8$	

Table 4: Peak positions in the total pair distribution function: Comparison of calculated values (CMD and BOMD) with experimental measurements for NVP25 and NVP43 systems.

Peak		NVP2	5		NVP43	
positions	Exp.	CMD	BO	Exp.	CMD	BO
1 <sup>st</sup> peak	1.51	1.50	1.50/1.62	1.59	1.51	1.59
2 <sup>nd</sup> peak	1.96	1.80	1.84	1.96	1.79	1.78
3 <sup>rd</sup> peak	2.51	2.48	2.56	2.57	2.46	2.58
4 <sup>th</sup> peak	3.26	3.52	3.39	3.23	3.53	3.37

#### 5.2. Partial pair correlation function

Among the partial pair correlation functions for VP50 glass, the V-O correlation showed the most significant improvements when moving from the initial CMD model to BOMD calculations [38]. In this work, the  $g_{VO}(r)$  partial pair correlation functions (see Figure 5) for NVP25 and NVP43 glasses reveal further discrepancies between CMD and BOMD, particularly in the short-range order. BOMD shows a clear splitting of the first peak into two distinct maxima at 1.6 Å and 1.8-1.9 Å, reflecting a better description of both V=O and V-O bonds. CMD, on the other hand, produces an averaged broader peak at 1.7–1.8 Å, with only a small shoulder at 1.6 Å for NVP25, indicating an oversimplified representation of vanadium-oxygen interactions. Beyond 3 Å, both methods follow similar trends, although CMD consistently predicts slightly larger r values. The discrepancies are more pronounced in NVP43, where CMD struggles to accurately capture the increased complexity of Na-V-P-O interactions, showing its limitations with higher vanadium content. These results emphasize the fact that BOMD better captures vanadium's local coordination environment. Having established the superior performance of BOMD in describing the V-O local environment, the following analysis of all partial pair correlation functions in this work is based on BOMD data rather than CMD ones. Turning to the other partial pair correlation functions, including the breakdown of the V-O correlation into contributions from V<sup>5+</sup>–O and V<sup>4+</sup>–O, Figure 6 presents the BOMDderived functions for  $g_{OO}(r)$ ,  $g_{NaO}(r)$ ,  $g_{V^{4+O}}(r)$ ,  $g_{V^{5+O}}(r)$ , and  $g_{PO}(r)$  for NVP25 and NVP43 glasses. Table 5 reports the bond lengths  $r_{\alpha\beta}$ , corresponding to the positions of the maxima in the partial pair correlation functions  $g_{\alpha\beta}(r)$ . In NVP25, the P–O correlation shows a main peak at 1.50 Å and a shoulder at 1.62 Å. The V<sup>5+</sup>–O correlations exhibit peaks at 1.62 and 1.84 Å, corresponding to V=O and V-O bonds, respectively. V<sup>4+</sup>–O has a main peak at 1.89 Å and a weak shoulder around 1.62 Å, associated with the low concentration of V<sup>4+</sup>. The combined contributions at 1.62 Å account for the splitting of the first peak in the total pair distribution function G(r) (Figure 4). For NVP43, the P-O correlation shows a single peak at 1.53 Å. The V<sup>5+</sup>–O correlation has a less-defined first peak at 1.62 Å (V=O), with a second peak at 1.75 Å, which is shorter than the corresponding peak in NVP25 (1.84 Å). No significant differences are observed in the Na<sup>+</sup>-O and O-O correlations between the two systems. The shorter V<sup>5+</sup>–O distances compared to V<sup>4+</sup>–O, as shown in Table 5, are consistent with a well-known feature in vanadophosphate crystalline phases: the increase in V-

O single bond length with decreasing vanadium oxidation state [46, 47]. Both  $V^{5+}$  and  $V^{4+}$  also exhibit at least one characteristic vanadyl bond. BOMD calculations successfully capture this nontrivial bonding pattern of  $VO_n$  polyhedra, showing good agreement with experimental trends. Specifically, BOMD reproduces short vanadyl bonds alongside longer single V-O bonds, with bond lengths corresponding to oxidation state as follows:  $V^{5+}-O < V^{4+}-O$ . The corresponding distances are 1.75-1.84 Å and 1.89-1.90 Å for NVP25 and NVP43, respectively. These results improve upon previous findings based solely on CMD simulations with empirical force fields, as reported for LiVP systems [6], highlighting the critical need for first-principles approaches to accurately describe such complex V-containing glass systems.

The data for NVP25 and NVP43 closely align, demonstrating that although the vanadium content is higher in NVP43, the local bonding environments around vanadium and sodium remain similar across both systems.



Figure 5: (Color online) Partial pair correlation function  $g_{VO}(r)$  showing results from CMD and BOMD. on the right side, a zoom in on the first peak between 1 and 3 Å.

#### 5.3. Coordination number and structural units

In this section, the average coordination numbers for Na, V, P, and O (BOMD data) are compared with experimental values (see Table 5). Phosphorus has a well-defined average coordination number of 4.0 for both systems, which aligns very well with experimental data. The total coordinations for vanadium predicted by BOMD are 4.76 and 4.75, falling within the experimental range of 4.20–5.40. For sodium, the calculated average coordination number is slightly higher than the experimental reference in both systems. The running average coordination number for cation-oxygen pairs, shown in Figure S1 (Supplementary Information), reveals distinct structural roles within the glass network. The Na<sup>+</sup>–O coordination environment does not exhibit a well-defined plateau, differing from other



Figure 6: Partial pair correlation functions for NVP25 and NVP43 glasses, displaying CMD and BOMD results for  $g_{OO}(r)$ ,  $g_{NaO}(r)$ , and  $g_{PO}(r)$ , respectively, from left to right.

Table 5: Average coordination numbers  $n_i$  bond lengths  $r_{\alpha\beta}$  (in Å) (taken as the position of the first maximum of the pair correlation functions  $g_{\alpha\beta}(\mathbf{r})$ ), calculated for the NVP25 and NVP43 models and averaged over the three replicas of BOMD data. We report the distances obtained from the first maximum of  $g_{\alpha\beta}(\mathbf{r})$ . The average statistical error across the replicas is 0.02 Å.

	Exp. <sup>a</sup>	NVP25	NVP43
<i>n</i> <sub>Na</sub>	4.0-6.0	6.58	6.81
$n_{\rm P}$	4.00	4.00	4.00
$n_{\rm V}$	4.20-5.40	4.76	4.75
$n_{\mathrm{V}^{5+}}$	-	4.69	4.62
$n_{\rm V^{4+}}$	-	5.37	5.38
n <sub>O</sub>	2.00-4.00	1.71	1.79
r <sub>NaO</sub>	2.30-2.60	2.33	2.34
$r_{\rm PO}$	1.52-1.60	1.50/1.62	1.53
$r_{\rm VO}$	1.58	1.62	1.62
	1.90	1.84	1.78
$r_{V^{5+}O}$	1.59-1.78 <sup>b</sup>	1.62	1.62
	1.80-2.35 <sup>b</sup>	1.84	1.75
$r_{\rm V^{4+}O}$	1.59-1.74 <sup>b</sup>	1.61	1.64
	1.80-2.12 <sup>b</sup>	1.89	1.90
<i>r</i> <sub>00</sub>	2.52-2.79	2.56	2.58
$r_{\rm VV}$	3.50	3.50	3.47
$r_{\rm PV}$	3.24	3.20	3.29

<sup>a</sup>Estimated from X-ray and neutron diffraction measurements on  $V_xO$ -P<sub>2</sub>O<sub>5</sub> [72, 73] and Na<sub>2</sub>O-V<sub>x</sub>O<sub>y</sub> [74] glasses. <sup>b</sup>Characteristic bond lengths intervals analysed from about 520 vanadophosphate crystalline phases [8, 45, 46].

cations. Na<sup>+</sup> features a high average coordination number in the 6–7 range and a bond length of approximately 2.33 Å, interacting with neighboring oxygens primarily through ionic bonds. In contrast,  $V^{4+}$ ,  $V^{5+}$ , and P interact with neighboring bridging oxygens predominantly via covalent bonds [38]. This is in favor of the glass-modifier role of Na<sup>+</sup>, contrasting with the glass-former roles of P and V. Previous studies on amorphous systems containing V, including both pure vanadium oxides and vanadophosphates containing alkali ions [26, 45, 46, 71, 75-78], have reported vanadium coordination numbers ranging from 4 to 6. This indicates that vanadium can act as either a glass network former (i.e. low coordination) or a modifier (i.e. high coordination), depending on the glass composition and in accordance with Zachariasen's model [79]. In the present work for both NVP models, the coordination number of  $V^{4+}$  is higher than the one of  $V^{5+}$  and phosphorus, yet the V4+-O bond distance remains comparable to V<sup>5+</sup>–O, while being significantly shorter than Na<sup>+</sup>–O bonds. This confirms that Na<sup>+</sup> is a network modifier with high coordination, while V<sup>4+</sup> behaves as an intermediate-to-weak network former, with an average coordination between 5 and 6. In contrast, V<sup>5+</sup> predominantly acts as a strong-to-intermediate glass network former (average coordination of 4 to 5), in part similar to phosphorus (coordination of 4) within the glass structure. To further obtain insights in the local environment of V and Na, we examined the distribution of  $VO_n$  and  $Na^+O_n$  structural units. Table 6 gives the BOMD-derived values for both systems. The  $VO_n$ units referred to total V are predominantly VO<sub>5</sub> (approximately 50%), followed by  $VO_4$  (about 35%), with a notable presence of VO<sub>6</sub> units (10–13%). These results align with findings from the VP50 system reported in [38]. A breakdown of the vanadium oxidation states in VO<sub>n</sub> units indicates that  $V^{5+}$  acts as a strong glass network former, predominantly existing as  $VO_4$  (40–42%) and VO<sub>5</sub> (51–54%) units, while  $V^{4+}$  displays an intermediate behavior, primarily existing as  $VO_5$  (49–57%) and  $VO_6$  (41–44%) units.

This perspective contrasts with earlier findings, based mainly on CMD simulations, pointing to both V<sup>5+</sup> and V4+ as intermediate former or modifier based on vanadium concentration. Previously, V4+ was thought to exhibit low coordination (four-fold) [26, 41, 80]. However, BOMD provides an entirely different perspective: both  $V^{5+}$  and  $V^{4+}$  form structural polyhedra that contribute to the glass network.  $V^{5+}$  exhibits low to intermediate coordination (4-5), reinforcing its role as a strong-to-intermediate glass network former. On the contrary V<sup>4+</sup> primarily shows higher coordination (5-6), indicating an intermediate-to-weak role, with both vanadium oxidation states displaying similar bond distances with oxygen. For  $Na^+O_n$ , the coordination numbers for Na<sup>+</sup> fluctuate between 4 and 9 across both systems, with Na<sup>+</sup>O<sub>6</sub> and Na<sup>+</sup>O<sub>7</sub> identified as the dominant structural units.

Table 6: Distribution of the individual  $n_{\alpha}(l)$  structural units where an atom  $\alpha$  (V or Na) is *l*-fold coordinated to oxygen atom, computed for the both NVP25 and NVP43 at BOMD level. These values have been calculated including neighbours within the first minimum in  $g_{\alpha\beta}(r)$ . The average is taken over the three replicas with given error bars. The cutoffs of 2.4 and 3.2 Å were used for the V–O and Na–O bonds respectively. Only fraction larger than 0.1 % are reported.

		NVP25	NVP43
V <sup>tot</sup>			
l = 4	$O_4$	$36.5 \pm 7.5$	$35.3 \pm 1.9$
<i>l</i> = 5	$O_5$	$50.6 \pm 8.4$	$54.1 \pm 5.6$
l = 6	$O_6$	$12.9 \pm 0.9$	$10.6 \pm 3.7$
$V^{5+}$			
l = 4	$O_4$	$40.1 \pm 7.2$	$42.1\pm2.6$
<i>l</i> = 5	$O_5$	$50.8 \pm 8.6$	$53.6 \pm 3.5$
l = 6	$O_6$	$9.1 \pm 1.4$	$4.4 \pm 1.0$
$V^{4+}$			
l = 4	$O_4$	$7.3 \pm 10.3$	$2.7 \pm 1.8$
<i>l</i> = 5	$O_5$	$48.6 \pm 7.1$	$56.7 \pm 15.9$
l = 6	$O_6$	$44.0 \pm 3.8$	$40.7 \pm 17.7$
$Na^+$			
<i>l</i> = 5	$O_5$	$12.7 \pm 3.7$	$8.5 \pm 0.2$
l = 6	$O_6$	$33.2 \pm 1.9$	$31.7 \pm 2.7$
l = 7	$O_7$	$36.6 \pm 5.3$	$34.8 \pm 2.2$
l = 8	$O_8$	$14.7 \pm 0.1$	$17.2 \pm 4.8$
<i>l</i> = 9	<b>O</b> 9	$1.9 \pm 0.2$	$5.6 \pm 1.7$

## 6. Bond angle distributions, network connectivity, and Na-glass former association preference

Figure 7 shows the bond angle distributions (BAD) for NVP25 and NVP43 glass systems, centered around various oxygen-containing triads. The V-O-V, V-O-P, and P-O-P distributions provide insights into the connectivity between different polyhedra in the glass network. The V-O-P distribution shows a broad main peak centered around 130-140° with a sharp, less intense peak centered at 90°, indicating a variable form of interconnectivity between the vanadium and phosphorus polyhedra. This broad distribution is indicative of a range of V-O-P bond angles representative of the structural flexibility in the glass network. The slight differences between NVP25 and NVP43 in the main peak in this distribution is a sign that the increase in vanadium content affects the V-P connectivity to some extent. The V-O-V BAD displays a broader distribution compared to V-O-P, with a main peak around 140°. This broadness reflects the variety of V-O-V connections in the glass network, including edge-sharing and corner-sharing between vanadium polyhedra. The similarity between NVP25 and NVP43 in this distribution indicates that the V-V connectivity is not significantly affected by the composition change. The P-O-P distribution shows a sharp peak at about 125°, which is characteristic of P-O-P linkages in phosphate glasses. The sharpness of this peak, compared to the V-O-V and V-O-P distributions stand for a more rigid and well-defined local structure around phosphorus atoms. The O-P-O BAD has a sharp peak centered at approximately 109°, indicative of the tetrahedral geometry of PO<sub>4</sub> units and persisting across NVP25 and NVP43, as shown by the overlapping peaks. The  $O-V^{5+}-O$  BAD displays a broad distribution ranging from approximately  $70^{\circ}$  to  $120^{\circ}$ , with a notable concentration around 108°. This proves the presence of different geometric configurations among the polyhedral units. Notably, the dominance of tetrahedral angles highlights a substantial contribution of V<sup>5+</sup>O<sub>4</sub> tetrahedra to the structural framework of the glass network. In contrast, the  $O-V^{4+}-O$  distribution shows a primary peak around 90°, a clear sign of the presence of octahedral and pyramidal geometries within the glass network. A secondary, smaller peak is observed near 170°, rather than at 180°, indicating distorted octahedra and pyramids. The absence of a significant peak around 109° implies a low proportion of V<sup>4+</sup>O<sub>4</sub> tetrahedra, which is consistent with the  $V^{4+}O_n$  structural unit analysis.

The network connectivity in NVP25 and NVP43 glasses reveals a complex interplay between phosphate and vanadium polyhedra, as demonstrated by  $Q^n$  distribution analysis.  $Q^n$  refers to a structural unit where nbridging oxygen (BO) atoms are directly linked to a network-forming ion, such as phosphorus in phosphate glasses. This analysis provides valuable insights into the degree of polymerization and the structural organization of these glass systems [11, 26]. Here, we come back to an explicit comparison between CMD and BOMD data, with the intent of highlighting the most significant differences. One of the most striking improvements brought by BOMD is in the description of the phosphate network connectivity. For NVP25, both CMD and BOMD agree on the predominance of  $Q^2$  species, but BOMD shows a higher proportion of Q<sup>3</sup> units. This suggests a more cross-linked phosphate network and a greater degree of three-dimensional connectivity than was evident from CMD alone. The differences are even more pronounced for NVP43. While CMD suggests an almost equal distribution of Q<sup>1</sup>, Q<sup>2</sup>, and Q<sup>3</sup> species, BOMD indicates a clear predominance of  $Q^2$ and Q<sup>3</sup> units. This suggests that the phosphate network in NVP43 maintains a higher degree of polymerization than previously assumed from CMD, and contradicts earlier views that increasing vanadium content would significantly depolymerize the phosphate net-



Figure 7: (Color online) Bond angle distributions for NVP25 (green line) and NVP43 (red line) models. The left panel shows angles centered around oxygen: P–O–P, V–O–P, and V–O–V (top to bottom). The right panel displays angles centered around network formers: O–P–O,  $O-V^{5+}$ –O, and  $O-V^{4+}$ –O (top to bottom).



Figure 8: (Color online) Comparison of the  $Q^n$  distribution, where n represents the number of bridging oxygen atoms directly linked to a network former P, between the CMD and BOMD simulations for NVP25 and NVP43. The data presented is averaged over three replicas, with the standard error bar indicated.

work. A comparison with previously reported data for VP50 glass [38], where BOMD models show a majority of  $Q^4$  (55–60%) and a notable fraction of  $Q^3$  (37–



Figure 9: (Color online) Comparison of the  $Q^n$  distribution, where n represents the number of non-bridging oxygen ([NB]) atoms directly linked to a network former V<sup>4+</sup> and V<sup>5+</sup>, between the CMD and BOMD simulations for NVP25 and NVP43. The data presented is averaged over three replicas, with the standard error bar indicated.

42%) units, further supports the role of Na ions as network modifiers, reducing the extent and interconnection of the phosphate network.

Turning to the vanadium network, BOMD provides a substantially different picture in terms of  $Q_{[NB]}^n$  (with *n* indicating non-bridging oxygen ([NB]) in this case)

compared to CMD, particularly for V<sup>5+</sup> species. In both NVP25 and NVP43, CMD predicts a dominance of Q<sup>0</sup><sub>[NB]</sub> environments for V<sup>5+</sup>, with a largely interconnected nature of such units. However, BOMD reveals a much more diversified distribution of V<sup>5+</sup> environments, with significant proportions of Q<sup>1</sup><sub>[NB]</sub> and Q<sup>2</sup><sub>[NB]</sub> species. This BOMD result indicates that V<sup>5+</sup> plays a more active role in network formation than previously understood, potentially contributing to the overall complex connectivity of the glass structure. For V<sup>4+</sup> species, while both methods agree on a preference for Q<sup>0</sup><sub>[NB]</sub> environments, BOMD is in favor of a more uniform distribution across different Q<sup>n</sup><sub>[NB]</sub> species, especially in NVP43.

To evaluate the preference of Na<sup>+</sup> ions for different network-forming species (P, V<sup>5+</sup>, V<sup>4+</sup>), we calculated the normalized preference ratio  $r_{\alpha/\beta}^{\text{Na}^+}$  [81] defined as:

$$r_{\alpha/\beta}^{\mathrm{Na}^{+}} = \frac{N_{\beta}}{N_{\alpha}} \frac{\mathrm{CN}_{\mathrm{Na}^{+}-\alpha}}{\mathrm{CN}_{\mathrm{Na}^{+}-\beta}},\tag{4}$$

where  $N_{\alpha}$  is the number of glass-former species  $\alpha$  and  $CN_{Na^{+}-\alpha}$  is the partial coordination number of Na<sup>+</sup> around species  $\alpha$ .

The calculated preference ratios are given in Table 7. The unit ratio reflects the statistical distribution of Na<sup>+</sup> ions around the  $\alpha$  and  $\beta$  species, which is strictly governed by their relative concentrations. Values less than 1 indicate a preferential coordination of Na<sup>+</sup> ions by species  $\beta$ , whereas values larger than 1 suggest a stronger affinity of species  $\alpha$  for coordinating Na<sup>+</sup> ions. The results show that Na<sup>+</sup> has a stronger affinity for P compared to V in both systems ( $r_{V/P}^{Na^+} < 1$ ). There is a slight preference for V<sup>4+</sup> over V<sup>5+</sup> ( $r_{V^{4+}/V^{5+}}^{Na^+} > 1$ ), although both V species are less favored than P. The preference for P over V is more pronounced in NVP25 compared to NVP43, as indicated by the lower  $r_{V/P}^{Na^+}$  value for NVP25.

 Table 7: Sodium-glass former connection preference ratio for NVP25

 and NVP43

	$\mathbf{R}^{Na^+}_{V/P}$	$\mathbb{R}^{Na^+}_{V^{5+}/P}$	$R^{Na^+}_{V^{4+}/P}$	$R^{Na^+}_{V^{4+}/V^{5+}}$
NVP25	0.60	0.60	0.65	1.09
NVP43	0.66	0.62	0.82	1.31

#### 7. Discussion

#### 7.1. General remarks

This study focussed on two sodium vanadium phosphate (NVP) glass compositions,  $(Na_2O)_{\alpha}$ - $(V_xO_y)_{(1-2\alpha)}$ - $(P_2O_5)_{\alpha}$  ( $\alpha = 0.375$ , 0.285), using a

combined approach of experimental characterization and atomic-scale modeling with both classical and Born-Oppenheimer molecular dynamics (CMD and BOMD, respectively). This approach provides a comprehensive understanding of the structural and bonding properties of these glasses. We underscored the limitations of classical MD and currently available empirical force fields, which, while valuable tools, fail to accurately capture the local structure, particularly regarding the complex interactions involving vanadium oxides. By explicitly incorporating electronic structure effects, BOMD simulations demonstrate a significantly enhanced ability to improve upon original CMD models. Despite the shortness of the dynamical equilibration at 300 K using BOMD, one can obtain structural features of NVP glasses of unprecedented quality, particularly for short- and medium-range order distances, as demonstrated by their close agreement with experimental X-ray diffraction data and pair distribution function analysis. One of the key findings is the important role of phosphorus in enhancing the rigidity of the NVP glass network. Sodium typically acts as a network modifier, disrupting the glass network, and potentially decreasing rigidity. However, NVP25 (with a higher content of sodium oxide) exhibits a higher glass transition temperature compared to NVP43. This is a key observation to understand the dominating influence of phosphorus, a stronger glass network former than vanadium, in dictating the overall rigidity of the glass structure. BOMD provides valuable insight into the speciation of vanadium sites within the glass structure. The analysis reveals that vanadium exists predominantly in the +5 oxidation state in both glasses, with a smaller but not negligible presence of vanadium in the +4 oxidation state. This is consistent with experimental XPS measurements and highlights the ability of BOMD to accurately capture the oxidation states of transition metals in these glassy systems.

#### 7.2. Revisiting NVP glasses structure: short- and intermediate range-orders

A closer examination of the short-range and intermediate-range orders in NVP glasses, using BOMD-derived data, sheds light on the interplay between phosphate and vanadium polyhedra within the glass network. The analysis of partial pair correlation functions, coordination numbers, bond angle distributions, and  $Q^n$  distributions allows obtaining a more precise understanding of the structural features underlying the properties of these glasses. The splitting of the V–O peak in the pair distribution function, revealed by BOMD simulations but not by CMD, reflects



Figure 10: Atomistic models of NVP25 (left) and NVP43 (right) glasses simulated using BOMD. Color legend (online): Na (yellow spheres),  $V^{5+}O_n$  polyhedra (blue),  $V^{4+}O_n$  polyhedra (light blue), PO<sub>4</sub> polyhedra (orange), O (red spheres).

the presence of both V=O and V-O bonds, indicating a more complex local environment around vanadium atoms than the one accounted for by classical force fields. Additionally, BOMD simulations shows a distinct difference in the average coordination numbers of V<sup>4+</sup> and V<sup>5+</sup>, with V<sup>4+</sup> exhibiting higher average coordination and an intermediate-to-weak network former character, while V5+, with lower average coordination, acts predominantly as a strong-to-intermediate network former. The analysis of bond angle distributions provides further evidence for the structural complexity of NVP glasses. The broad distributions observed for V-O-V and V-O-P angles, compared to the sharper peak for O-P-O, are indicative of a greater degree of flexibility and a range of possible configurations for vanadium polyhedra within the glass network. This flexibility, coupled with the varying roles of V<sup>4+</sup> and V<sup>5+</sup>, contributes to the unique properties of NVP glasses. Finally, the  $Q^n$  distribution analysis, particularly the differences observed between CMD and BOMD predictions, highlights the importance of accurate modeling in understanding network connectivity. Figure 10 shows the degree of complexity of the glass networks in NVP25 and NVP43, with the interconnected phosphate and vanadate polyhedra, as well as the open structure facilitated by the incorporation of Na ions. These BOMD insights allow us to revisit our understanding of NVP glasses in several key points: i) The phosphate network appears to maintain a higher degree of polymerization than previously thought, even at higher vanadium contents. This could explain the observed stability and favorable properties of these glasses

in various applications [5, 6, 11, 15, 82]; ii)  $V^{5+}$  emerges as a more active network former, potentially creating additional linkages in the glass structure; iii) BOMD reveals a more diverse range of local environments, especially for vanadium species. This structural heterogeneity is crucial for understanding the glass's behavior under various conditions, such as its response to ion insertion/extraction in battery applications.; iv) The BOMD results provide a more complete view of how changing vanadium content affects the glass structure, leading to the conclusions that the relationship between composition and network connectivity is more complex than previously understood.

It remains true that certain aspects still require further efforts, such as extending the thermal relaxation at the BOMD level and enhancing the comparison with experimental data on the total structure factor at the level of the intermediate range order. This feature is still poorly described by both CMD (to a greater extent) and BOMD (to a lesser extent). We also remark that the significant enhancement in the local V-O bonding environment achieved with BOMD enables a better quantification of oxygen speciation, including bridging oxygens (BO) and non-bridging oxygens (NBO) within the glass network. Understanding these factors is crucial as they significantly impact sodium ion mobility [80, 83-85]. Achieving such improved insight into network connectivity will have important implications for interpreting the macroscopic properties of NVP glasses, including thermal stability, conductivity, and ion transport.

#### 8. Conclusions

This study provides a comprehensive analysis of two sodium vanadium phosphate (NVP) glasses by combining experimental characterization with atomicscale modelling. It emphasizes the importance of completing a classical molecular dynamics trajectory with the use of first-principles molecular dynamics (of the Born-Oppenheimer kind in this case) to describe quantitatively the structural and bonding features of these glassy systems. This is crucial even at the relatively low temperature (T= 300 K), proving that the account of electronic structure effects is able to impact the network well beyond a mere structural rearrangement. Although classical molecular dynamics using the Bertani et al. force field [25, 48] provides a valuable ground for structural modeling improving upon other available force fields [38], it is unable to describe correctly the local environment around vanadium atoms, particularly the V-O bonding. The present findings reveal that NVP25, which has a higher phosphate content, exhibits a higher glass transition temperature compared to NVP43, underscoring the significant role of phosphorus as a strong network former in enhancing the rigidity of the glass structure. BOMD simulations also provide a clearer picture of vanadium speciation, accurately identifying the presence of both  $V^{4+}$  and  $V^{5+}$  oxidation states, along with the splitting of V-O bonds. These details are beyond the reach of CMD. V<sup>5+</sup> primarily works as a strong-to-intermediate glass network former, while V<sup>4+</sup> behaves more like a intermediate-to-weak network former fully in line with a number experimental results [43, 44, 86] but in contrast with previous models based on X-ray absorption near edge structure (XANES) [41, 42, 87] data or CMD calculations [6, 26, 41]. BOMD reveals a complex interplay of short- and intermediate-range order within the glass network, indicating a rich local environment around vanadium atoms. Further investigation into the roles of bridging and non-bridging oxygens could provide deeper insights into their influence on ionic conductivity in NVP glasses.

#### Acknowledgement

The authors acknowledge High Performance Computing Centers support from GENCI (Grand Equipment National de Calcul Intensif; grants n. A0160807670, A0160912441, A0160910832, and A0160913426), the University of Strasbourg (Pole HPC Équipe@Meso (Program Investissements d'Avenir) and the CPER Alsacalcul/Big Data), and the région Nouvelle Aquitaine via the CANaMIAS project AAPR2021-2020-11779110. We acknowledge financial support from the Agence Nationale de la Recherche (ANR) within the framework of the project AMSES (ANR-20-CE08-0021) and the EUR-QMAT-ANR under the contract ANR-11-LABX-0058-NIE and ANR-17-EURE-0024 within the Investissement d'Avenir program ANR-10-IDEX-0002-02.

#### Data availability

NVP models obtained by BOMD as well as XRD experimental data are available at the European Center of Excellence Novel Materials Discovery (CoE-NOMAD) repository [88].

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