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Experimental Validation of Calculated Atomic Charges in Ionic Liquids

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Abstract

A combination of X-ray photoelectron spectroscopy (XPS) and near edge X-ray absorption fine structure (NEXAFS) spectroscopy have been used to provide an experimental measure of nitrogen atomic charge in nine ionic liquids (ILs). These experimental results are used to validate charges calculated with three computational methods: charges from electrostatic potentials using a grid-based method (ChelpG), natural bond orbital (NBO) population analysis and the atoms in molecules (AIM) approach. By combining these results with those from a previous study on sulfur, we find that ChelpG charges provide the best description of charge distribution in ILs. However, we find that ChelpG charges can lead to significant conformational dependence and therefore advise that small differences in ChelpG charges ($<0.3 e$) should be interpreted with care. We use these validated charges to provide physical insight into nitrogen atomic charges for the ILs probed.

1. Introduction

Ionic liquids (ILs) are liquids composed solely of mobile cations and anions. ILs are promising materials for a wide range of applications: solvents for catalysis;¹ electrolytes for electrodeposition, batteries and supercapacitors;²⁻⁵ materials for gas separation and storage;^{6, 7} solvents for nuclear fuel reprocessing.⁸ However, the full potential of ILs is currently unrealised, partly owing to the lack of understanding between how varying molecular properties (*i.e.* the chemical nature of the constituent ions) affects macroscopic properties (*i.e.* viscosity). In this paper, we aim to gain a better understanding of how to represent the charge distribution of individual ions in ILs.

Almost all ILs are composed of molecular (or atomic) ions with an overall formal charge of ± 1 (there are some ILs formed from ions with ± 2 charge). Thus, the primary factor that differentiates ILs from each other is not the overall charge of individual ions; differences between ILs must be dependent on the charge distribution. There are two ways to describe variation in charge distribution for ILs: (i) differences in how the charge is distributed within a particular ion and (ii) transfer of charge from the anion to the cation (*i.e.* non-integer values of total ion charge).

Results from molecular dynamics (MD) simulations have shown that even quite subtle differences in the charge distribution in an IL can strongly affect macroscopic properties of the IL.⁹⁻¹⁷ Varying the charge distribution within each ion, while keeping a $\pm 1 e$ charge on each ion, can significantly affect dynamic properties. For example, Li and Kobrak compared MD simulations using octahedral ions with either a symmetric (charge spread equally over the ion) or non-symmetric (charge localised on one half of the ion) charge distribution.⁹ The symmetric, compared to non-symmetric, charge distribution led to significantly slower diffusion but faster rotational dynamics.⁹ Multiple other MD studies have found that varying charge distribution can lead to

significant changes in predicted structural, dynamic or energetic properties.¹⁰⁻¹⁷ Therefore, understanding the charge distribution within ILs is key to linking IL composition with macroscopic physical properties.

Charge distribution is often represented in terms of atomic charges. The atomic charge of atom A , $q(A)$, is defined as $q(A) = Z_A - \rho_A$, where Z_A is the atomic number of A and ρ_A is the total electron density assigned to A . The density at any point in space, $\rho(r)$, is an observable property; however, there is no unambiguous way to partition this density between atomic centres (*i.e.* ρ_A cannot be determined unambiguously). As a result, a range of methods exist for determining ρ_A (and hence, $q(A)$). The majority of $q(A)$ assignment methods fall into one of three categories: density-, wavefunction- or electrostatic potential (ESP)-based methods.

The “Atoms in Molecules” (AIM) approach involves the direct analysis of the topology of the electron density.^{18,}
¹⁹ Around each nucleus exists a surface for which the flux of the electron density gradient field is zero. These surfaces are used to partition a system into a set of nuclear basins. AIM $q(A)$ are obtained by assigning all electron density in a nuclear basin to the relevant nucleus. AIM $q(A)$ are known to be significantly larger in magnitude than those produced by other methods, either wavefunction- or ESP-based.^{20, 21}

Wavefunction (or population analysis methods) require the electron density to be expanded in terms of a basis set; often the atomic orbitals (AOs) form the basis functions. The electron density is then divided among the basis orbitals; the exact procedure varies between methods. Electron density is subsequently assigned to the atom on which the basis orbital is centred, and summing over the density in each basis orbital enables $q(A)$ to be calculated. A problem is that some population analysis methods (*e.g.* Mulliken) can show a strong basis set dependence.²² The population analysis method used in the current work, natural bond orbital (NBO) analysis, reduces the basis-set dependence by expressing the density in terms of natural orbitals which are localised AOs for a particular molecular environment.^{23, 24} Wavefunction methods of this type are inherently local, tied to the atomic centre and are not strongly influenced by charge distributions outside of the atomic region. We call

charges derived from NBO analysis “NBO charges” (NPA charges is an equivalent name); these charges are known to overestimate the magnitude of the ESP,²⁰ but to a lesser extent when compared with AIM.

The first step in ESP methods is to calculate the ESP (using the total electron density and nuclear co-ordinates) at a range of points – we will label this ESP_{ed} . A second ESP (ESP_{pc}) is then calculated at each point using solely a set of point charges centred at each nucleus, $q(A)$. $q(A)$ are subsequently varied to minimise the difference between ESP_{ed} and ESP_{pc} . Thus, the calculated $q(A)$ are those which best reproduce the true ESP of the system. Different ESP methods vary mainly in the selection of fitting points; for example, a rectangular grid of points is used in the “charges from electrostatic potential using a grid based method” (ChelpG) that is used in the current work.²⁵ The fitting points for ESP methods are generally reasonably far from any nuclei (a distance of 1 to 1.4 times the van der Waals radius). This results in the problem of “buried charges” for ESP methods.^{26, 27} ESP_{pc} is much less sensitive to varying $q(A)$ for a buried atom than an exposed one; hence, $q(A)$ on a buried atom is said to be poorly determined, and care should be taken when interpreting such data.²⁶

$q(A)$ are mathematical constructs, not inherent physical quantities; thus, $q(A)$ cannot be directly experimentally measured. The results of each $q(A)$ assignment method are termed “charges”. However, each method describes something slightly different. Thus, $q(A)$ from each method should not be thought of as identical, despite the common terminology generally used. Different $q(A)$ assignment methods can lead to qualitatively different charge distributions for ILs. For example, the nitrogen atomic charge, $q(N)$, in $[C_4C_1Im]Cl$ (1-butyl-3-methylimidazolium chloride) was calculated as $q(N) = -0.3 e$ using NBO and as $q(N) = +0.1 e$ using ChelpG.^{11, 28} The ChelpG $q(N)$ suggests that the anion will be electrostatically attracted to the nitrogen atom in $[C_4C_1Im]^+$, whereas NBO $q(N)$ suggests that the anion will be repelled from the cationic nitrogen. The NBO $q(N)$ is consistent with nitrogen being an electronegative atom, whereas the ChelpG $q(N)$ is not. The qualitatively different conclusions that can be drawn from NBO and ESP methods demonstrate the importance of understanding the kind of information each “charge” delivers. The qualitative differences are unsurprising,

given that electron density and wavefunction methods are based on the electron density (mostly) within the van der Waals radii of atomic centres, whereas ESP methods are based on the ESP outside of this region, *i.e.* not only are different quantities being examined, they are being evaluated in orthogonal spatial regions. No $q(A)$ method adequately addresses issues relating to anisotropic electron density or ESP distributions. A point charge is a spherically isotropic entity; it cannot easily represent situations in which the charge density varies rapidly or the ESP is better represented by a local dipole or quadrupole. There has now been substantial work carried out to examine higher multipoles, both for ESP and density-derived charges.²⁹⁻³¹ Nevertheless, $q(A)$ are frequently used in MD simulations, to interpret the electronic structure and to understand electrostatic interactions. From this perspective, it is extremely valuable to find which $q(A)$ assignment method best correlates with experimental values that approximate $q(A)$.

Both X-ray photoelectron spectroscopy (XPS) and near edge X-ray absorption fine structure (NEXAFS) spectroscopy can provide indirect yet separate measures of $q(A)$. To obtain an indirect experimental measure of $q(N)$ the ground state of ILS need to be probed, *i.e.* initial state effects. However, experiments always include some contribution from the excited state, *i.e.* final state effects. Therefore, the potential contributions of initial and final state effects to XPS and NEXAFS spectroscopy must be considered; these effects are different for the two techniques, meaning that trends across the same sample set do not always match.^{21, 32, 33} We have previously demonstrated that XPS and NEXAFS spectroscopy should be used as complimentary techniques for probing $q(A)$.²¹ XPS is best for detecting relatively large differences in $q(A)$ between structurally diverse systems, whereas NEXAFS spectroscopy is best for detecting relatively small differences in $q(A)$ between structurally very similar systems.²¹

Experimental core orbital electron binding energies, E_B , measured using XPS represent the energy required to remove an electron from an orbital, *i.e.* the negative of the orbital energy; more stable orbitals have larger E_B . Core orbital E_B values mainly depend on the element and type of orbital (*e.g.* C 1s orbitals have $E_B \sim 280$ eV), but

the local atomic environment can cause (relatively) small E_B shifts. For example, the C 1s E_B for the alkyl chain carbon atoms of $[\text{C}_8\text{C}_1\text{Im}]^+$ is $E_B = 285.0$ eV compared with $E_B = 292.9$ eV for carbon in $[\text{NTf}_2]^-$ ($-\text{CF}_3$ group).³⁴ The E_B difference arises because the $-\text{CF}_3$ carbon has lower electron density near its nucleus than the alkyl carbon (hence, the $-\text{CF}_3$ carbon can be thought of as more positively charged). In general, larger E_B corresponds to a more positively charged atom. This statement is supported by previous studies correlating E_B values with calculated charges for carbon, boron, nitrogen and sulfur atoms.^{21, 35-40} Furthermore, E_B shifts between ILs are routinely interpreted in terms of $q(\text{A})$.⁴¹⁻⁴⁹ However, E_B also depends on the ability of the system to stabilise the core-hole following electron removal; this effect is independent of ground state $q(\text{A})$ and is termed a final state effect. We have previously suggested that, owing to final state effects, differences in $E_B < 0.5$ eV should not be interpreted in terms of $q(\text{A})$ (based on final state effects measured with Auger spectroscopy for sulfur atoms in ILs).²¹

NEXAFS spectroscopy involves measuring the energy required to excite a core electron into unoccupied molecular orbitals (UMOs). The lowest energy core \rightarrow UMO transition observed (for a given atom) is labelled the edge energy (E_{NEXAFS}). E_{NEXAFS} is commonly interpreted in terms of oxidation state, with a larger E_{NEXAFS} corresponding to a higher oxidation state (hence, more positive $q(\text{A})$).⁵⁰⁻⁵⁵ The electron is not removed from the sample in NEXAFS spectroscopy (whereas the electron is removed from the sample in XPS). Therefore, final state effects for NEXAFS spectroscopy are generally smaller than for XPS. Consequently, NEXAFS spectroscopy can potentially provide a superior measure of initial state effects (*i.e.* $q(\text{A})$) relative to XPS. However, E_{NEXAFS} also depends on UMO energies (defined here as a final state effect). Therefore, NEXAFS spectroscopy is most suitable to probe $q(\text{A})$ in two situations: (i) when the nature of core orbital \rightarrow UMO transitions are similar between samples or (ii) when differences in $q(\text{A})$ are sufficiently large so as to dominate E_{NEXAFS} differences.

Previous studies have attempted to find the most suitable $q(\text{A})$ assignment method for ILs.^{21, 56} Rigby and Izgorodina assessed the validity of different $q(\text{A})$ assignment methods using criteria such as basis-set

dependence, differences in $q(A)$ assigned to symmetry-equivalent atoms and invariance of ring atom $q(A)$ in $[C_nC_1Im]^+$ (1-alkyl-3-methylimidazolium) for increasing n .⁵⁶ ESP based methods and NBO $q(A)$ both performed well in these tests. We have previously assessed the validity of AIM, ChelpG and NBO methods by comparing calculated sulfur charges, $q(S)$, with results from XPS and NEXAFS spectroscopy.²¹ Both NBO and ChelpG $q(S)$ correlate well with the experimental data, whereas AIM $q(S)$ did not. Furthermore, ChelpG $q(S)$ was found to exhibit a high conformational dependence.

A combination of N 1s NEXAFS spectroscopy and XPS has been used to provide an indirect experimental measure of $q(N)$ for a range of nine ILs (Figure 1). In our earlier study of $q(S)$, S was present predominantly in anionic species, whereas in this study N features in a more balanced range of cationic and anionic species. $q(N)$ has been computed for the same ILs using a $q(A)$ assignment methods from each of the three different categories: AIM (an electron density method), NBO (a wavefunction method) and ChelpG (an ESP method). The validity of these $q(A)$ assignment methods was assessed by comparing calculated $q(N)$ with spectroscopic results. Finally, based on a combination of experimental and computational results, the relative ordering of $q(N)$ for the ILs studied has been determined.

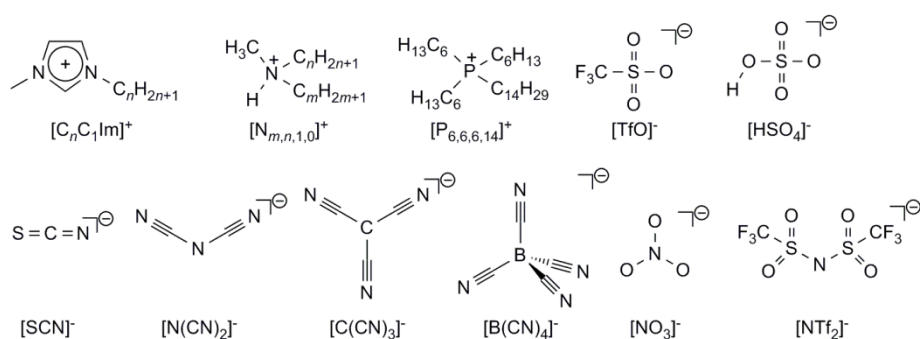


Figure 1. Structures and abbreviations for all ions (except Cl^-) used in this study.

2. Methods

2.1. Experimental methods

[N_{8,1,1,0}][HSO₄] (octyl(dimethyl)ammonium hydrogensulfate), [N_{2,2,1,0}][TfO] (diethyl(methyl)ammonium trifluoromethylsulfonate), [C₈C₁Im][SCN] (1-octyl-3-methylimidazolium thiocyanate) and [C₈C₁Im][C(CN)₃] (1-octyl-3-methylimidazolium tricyanomethanide) were purchased from Iolitec; [C₄C₁Im][SCN] (1-butyl-3-methylimidazolium thiocyanate) and [C₄C₁Im][N(CN)₂] (1-butyl-3-methylimidazolium dicyanamide) were purchased from Sigma-Aldrich; and [C₆C₁Im][B(CN)₄] (1-hexyl-3-methylimidazolium tetracyanoborate) was purchased from Merck. [P_{6,6,6,14}][NO₃] (tetradecyl(trihexyl)phosphonium nitrate), [N_{4,1,1,0}][HSO₄] (butyl(dimethyl)ammonium hydrogensulfate), [C₈C₁Im]Cl (1-octyl-3-methylimidazolium chloride) and [C₈C₁Im][NTf₂] (1-octyl-3-methylimidazolium bis((trifluoromethane)sulfonyl)imide) were synthesised using established literature procedures.⁵⁷⁻⁵⁹ The purities of all IL samples synthesised in our laboratories were assessed using ¹H NMR and ¹³C NMR spectroscopy. Sample purity was confirmed through XP survey and core-level spectra (ESI Figures S2 to S9 for the XP spectra). Furthermore, all measurements were carried out under ultra-high vacuum (pressure ~10⁻⁹ mbar) conditions under which volatile impurities (such as water) are removed.

The dialkylimidazolium ILs were chosen as these all contain nitrogen atoms, and are the most important cations for the IL community. A dialkylimidazolium cation was paired with an anion, Cl⁻, that does not contain nitrogen to allow the dialkylimidazolium cation to be recorded without any anionic nitrogen atom contributions to the N 1s NEXAFS spectrum. Dialkylimidazolium cations were paired with anions that do contain nitrogen ([C(CN)₃]⁻, [SCN]⁻, [NTf₂]⁻) so that the anions could be studied, and the cations too if possible. [P_{6,6,6,14}][NO₃] was chosen to allow the N 1s NEXAFS spectrum of the [NO₃]⁻ anion to be recorded without any cationic nitrogen atom

contributions to the N 1s NEXAFS spectrum. The same rationale was used to choose the ammonium-based ILs; ILs were chosen that do contain nitrogen atoms in the anion.

XPS was carried out using a Thermo K-alpha spectrometer utilising Al K α radiation ($h\nu = 1486.6$ eV) and a quartz crystal monochromator set in a 250 mm Rowland circle. The X-ray spot was focussed at the sample to a size of 400 μm . The base pressure was 10^{-9} mbar, and the analyser was a double focusing 180° hemisphere with mean radius 125 mm which was run in constant analyser energy mode. The pass energy was set to 200 eV for the survey scan, 20 eV for core level spectra and 50 eV for VB spectra. The detector was a 128 channel position sensitive detector. The energy scale of the instrument was regularly calibrated using a three point (Cu, Ag, Au) scale. A drop of IL was placed directly onto a stainless steel plate (using a spatula). This plate was placed in a loadlock and the pressure reduced to 10^{-7} mbar by pumping down overnight. After attaining the required pressure, the IL was transferred to the analysis chamber ($\sim 10^{-9}$ mbar). Etching was carried out using a 500 eV Ar $^+$ ion gun. Charge compensation was applied to all ILs studied here, and was achieved using a dual beam flood gun which applies both electrons and low energy Ar $^+$ ions to the sample.

All XP spectra were fitted using CASAXPSTM software. Fitting was carried out using a Shirley background and GL30 lineshapes (70% Gaussian, 30% Lorentzian). Peak constraints used are outlined in the ESI, Section 1. Relative sensitivity factors from ref ⁶⁰ were used to ensure the experimental stoichiometries matched the nominal stoichiometries. For the majority of ILs, charge referencing was carried out by shifting spectra so that C_{alkyl} 1s = 285.0 eV; this value was obtained from ref. ³⁴ (see ESI Section 1 for more details on charge referencing).

All NEXAFS spectra were recorded at MAX-lab on beamline I311 on the MAX-II storage ring.⁶¹ A drop of IL was deposited (with a spatula) onto a Molybdenum sample holder (ILs had to be liquid at room temperature for this experimental set-up). Samples were pumped slowly to 10^{-6} mbar before being transferred to the $\sim 10^{-9}$ mbar

analysis chamber. The base pressure in the analysis chamber was in the range of 5×10^{-10} mbar. The end-station was equipped with a Scienta SES200 hemispherical electron analyser; spectra were collected using partial electron yield detection. Spectra were fitted with a smoothing spline, using the MATLABTM curve fitting toolbox, from which the first derivative spectrum was generated. E_{NEXAFS} was then obtained as the energy of the first peak in the first derivative spectrum (see ESI Figure S1 for an example).

2.2. Computational Methods

Calculations were carried out at the B3LYP/6-311+G(d,p) level using the Gaussian 09 suite of programs.⁶²⁻⁶⁶ Dispersion was accounted for using Grimme's D3 dispersion correction with Becke-Johnson damping, D3(BJ). [P_{6,6,6,14}][NO₃] is an exception as only D3 was used, due to difficulties with low negative frequencies when using D3(BJ) for these structures.^{67, 68} The self-consistent field convergence criteria were set to 10^{-7} on the energy matrix and 10^{-9} on the density matrix. Numerical integration was carried out using a pruned grid with 99 radial shells and 590 angular points per shell.

Optimisations were carried out under no symmetry constraints, and all structures were confirmed as minima by frequency analysis. Initial optimisation was carried out in the gas phase (GP) followed by optimisation in a generalised IL solvent environment using the SMD model⁶⁹, labelled herein as IL(SMD). The SMD model parameters for [C₄C₁Im][PF₆] from ref. ⁷⁰ have been used. Differences between the solvation environment provided by particular IL solvents are expected to be minimal unless strong H-bonding is present, in this respect protic ILs may show a greater variation.

Systems were treated as ion pairs, *i.e.* one cation and one anion. For each ion pair, a range of potentially accessible structures was generated by placing the anion in various positions (based on those isolated for [C₄C₁Im]Cl) around the lowest energy cation conformer and subsequently optimising the structures in the GP.

In particular, for $[C_4C_1Im][A]$ ILs, “in-plane” structures facilitated by H-bonding, and “top” and “bottom” structures facilitated by anion–pi interactions were explored. A similar strategy was used for the ammonium– and phosphonium–based $[E_{n,m,o,p}][A]$ ILs (where the central atom E is nitrogen or phosphorus); anions were placed on each of the unique “tetrahedral faces” or between the ligands and optimised. Subsequently, stable GP structures were optimised within the IL solvent environment IL(SMD). Small rotations of the anion or of the cation alkyl chains within cations are not expected to substantially affect the electrostatic potential or covalent bonding within the ions; thus, an exhaustive search of all minor conformer variants was not carried out. Emphasis was placed on surveying a good range of conformer variants, such as identifying all conformers in which the anion took up substantially different positions around the cation. The number of major conformers identified for each IL differs ranging from 4 to 11. In many cases the number of stable conformers is reduced within the IL environment, as is the energy range of the conformers. The energies of the SMD optimised conformers used in this study were all within 26 kJ mol^{-1} of the lowest-energy conformer. Images of the individual GP conformers are presented in the ESI Figures S14 to S22 (the SMD conformers are very similar) GP and IL(SMD) ΔG , ΔE and $q(A)$ are listed in accompanying ESI Tables S4 to S21.

AIM $q(A)$ were calculated using AIMAll.⁷¹ NBO $q(A)$ were calculated using NBO version 5.9, overriding the older default version in Gaussian 09.⁷² ChelpG $q(A)$ were calculated in Gaussian 09 using default settings. The $q(N)$ reported for $[C_nC_1Im][A]$ ILs are from calculations using the $[C_4C_1Im]^+$ cation; the average of both nitrogen atoms is reported in all cases. The $q(N)$ reported are based on an unweighted average of all the conformers obtained. The accuracy of density functional theory (DFT) methods is $\approx 5 \text{ kJ mol}^{-1}$ to 10 kJ mol^{-1} ; thus, conformers with energies lower than 10 kJ mol^{-1} should be treated as energetically equivalent. Slightly higher energy conformers will be accessible at room temperatures. However, on using the IL(SMD) environment the energy range of all conformers reduced to $<26 \text{ kJ mol}^{-1}$. Thus, to remain consistent at both levels of calculation (*i.e.* $q(N)$ of GP and IL(SMD) computed using the same structures) the higher energy GP structures were included in the averages. In MD simulations an average point charge model is required, as only a single charge

distribution is applied to all molecules; thus, the use of an average over all low-energy conformers is advantageous. $q(N)$ for all individual conformers both in the GP and IL(SMD) are reported in the ESI Tables S4 to S21 and can be individually interrogated.

3. Results and Discussion

3.1. Experimental Results

Figure 2 shows N 1s XP spectra and N 1s NEXAFS spectra for the ILs studied. Each separate nitrogen electronic environment gives a single peak in the XP spectra (Figure 2a). For example, the $[\text{C}_4\text{C}_1\text{Im}][\text{SCN}]$ N 1s XP spectrum contains two peaks in an intensity ratio of 2:1; the more intense peak is from the two nitrogen atoms in $[\text{C}_4\text{C}_1\text{Im}]^+$ (which are indistinguishable by XPS⁴²), and the other peak⁷³ is from the single nitrogen atom in $[\text{SCN}]^-$. Peaks in the NEXAFS spectra are identified using a combination of experiments (identifying peaks by a process of elimination) and time-dependent DFT calculations; see ref. ⁷⁴ for more details on peak identification in NEXAFS spectra.

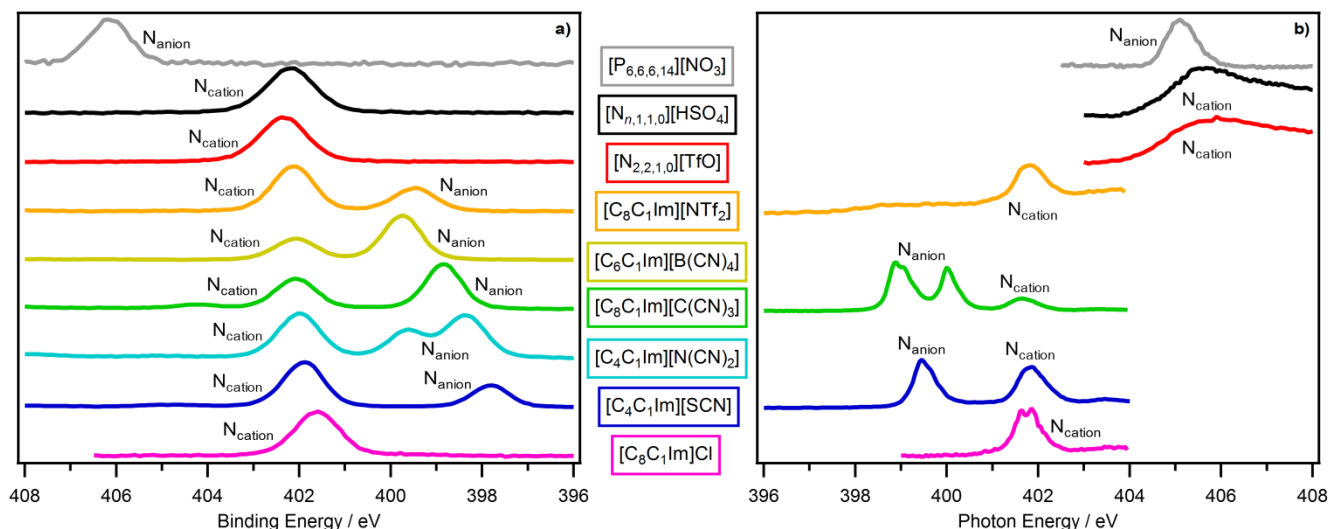


Figure 2. a) XPS N 1s core-level spectra and b) NEXAFS N 1s spectra for all ILs studied. The imidazolium peak occurs between $E_B = 401.6$ eV and $E_B = 402.1$ eV for the XPS data and at $h\nu = 401.9$ eV for the NEXAFS spectroscopy data. All XP spectra have been charge referenced, as described in ESI Section 1. The features at $h\nu < 400$ eV for $[\text{C}_8\text{C}_1\text{Im}][\text{NTf}_2]$ are most likely owing to sample damage (see ref. ⁷⁴ for more details on peak identification in NEXAFS spectra). NEXAFS spectra have not been recorded for $[\text{C}_6\text{C}_1\text{Im}][\text{B}(\text{CN})_4]$ or

$[C_4C_1Im][N(CN)_2]$. For $[N_{n,1,1,0}][HSO_4]$ the XP spectrum is for $n = 8$ and the NEXAFS spectrum is for $n = 4$. By convention, the binding energy and photon energy x axes are plotted in opposite directions.

The shape of the N 1s NEXAFS spectra (Figure 2b) varied significantly between the different nitrogen environments. A single, sharp peak is observed for the majority of nitrogen environments probed (*e.g.* for $[C_8C_1Im]^+$, $[SCN]^-$ and $[NO_3]^-$), but a broad feature (with no clear peak) was observed for $[N_{4,1,1,0}]^+$ and $[N_{2,2,1,0}]^+$ (see ref. ⁷⁴ for more details on the shape of these features). No clear peak is observed for $[NTf_2]^-$; this observation is consistent with previous studies that suggest N 1s peaks for $[NTf_2]^-$ and $[C_4C_1Im]^+$ occur at similar photon energies.⁷⁴⁻⁷⁷ E_{NEXAFS} values can vary owing to the identity of the UMOs that the electron from the core N 1s orbital is excited into, *i.e.* by $N\ 1s \rightarrow UMO$; this is a final state effect. Thus, interpreting E_{NEXAFS} in terms of $q(N)$ (*i.e.* an initial state effect) requires similar $N\ 1s \rightarrow UMO$ transitions, which is not the case for the wide range of nitrogen covalent bonding environments studied here. Evidence of the differences in $N\ 1s \rightarrow UMO$ can be found in the strongly varying edge shapes of N 1s NEXAFS spectra for the ILs studied here (*e.g.* compare N 1s spectra for $[N_{4,1,1,0}][HSO_4]$ and $[C_8C_1Im]Cl$ in Figure 2b). The differences in edge shape suggest that the nature of probed excited states differ significantly between the ammonium- and imidazolium-based ILs. However, for all four of the $[C_nC_1Im][A]$ ILs studied here the nitrogen atoms in the $[C_nC_1Im]^+$ cation gave a single Gaussian-shaped peak (Figure 2b), as did time-dependent DFT calculations (see ref. ⁷⁴). These results strongly suggest that the UMOs of interest are the same for all four $[C_nC_1Im][A]$ ILs. Consequently, the final state effect contribution from the UMOs to E_{NEXAFS} are expected to be the same for all four $[C_nC_1Im][A]$ ILs. For a more detailed analysis of these NEXAFS spectra see ref. ⁷⁴.

N 1s E_B and E_{NEXAFS} values are shown in Table 1. A more positive $q(A)$ is expected to lead to a larger value of either E_B or E_{NEXAFS} . Both E_B and E_{NEXAFS} results suggest $q(N)$ increases (becomes more positive) in the order $[X(CN)_y]^- < [C_nC_1Im]^+ < [NO_3]^-$, but unfortunately trends in E_B and E_{NEXAFS} are inconsistent for the other ILs (potential reasons for this will be discussed shortly in Section 3.3).

Table 1. Calculated $q(\text{N})$ from ion pair (GP) calculations for the three different $q(\text{N})$ assignment methods, N 1s binding energies (E_{B}) and N 1s NEXAFS edge energies (E_{NEXAFS}) for a range of ILs ^a

Ionic Liquid		$q(\text{N})$ from	$q(\text{N})$ from	$q(\text{N})$ from	$E_{\text{B}} (\pm 0.1) / \text{eV}$	$E_{\text{NEXAFS}} (\pm 0.1) / \text{eV}$
		AIM / e	ChelpG / e	NBO / e		
[C ₈ C ₁ Im][NTf ₂]	anion	-1.6	-0.7	-1.2	399.5	NP ^a
[C ₄ C ₁ Im][SCN]	anion	-1.3	-0.7	-0.6	397.8 †	399.3
[C ₄ C ₁ Im][N*(CN) ₂]	anion	-1.2	-0.7	-0.7	399.7	X ^b
[C ₄ C ₁ Im][N(CN*) ₂]	anion	-1.2	-0.7	-0.6	398.4	X ^b
[C ₈ C ₁ Im][C(CN) ₃]	anion	-1.2	-0.6	-0.4	398.8	398.8
[C ₆ C ₁ Im][B(CN) ₄]	anion	-1.2	-0.5	-0.4	399.8	X ^b
[P _{6,6,6,14}][NO ₃]	anion	+0.8	+1.0	+0.7	406.1	404.8
[C ₈ C ₁ Im]Cl	cation	-1.2	+0.1	-0.4	401.6	401.5
[C ₄ C ₁ Im][SCN]	cation	-1.2	+0.1	-0.4	401.9 †	401.5
[C ₄ C ₁ Im][N(CN) ₂]	cation	-1.2	+0.1	-0.4	402.0	X ^b
[C ₈ C ₁ Im][C(CN) ₃]	cation	-1.2	+0.2	-0.4	402.1	401.4
[C ₆ C ₁ Im][B(CN) ₄]	cation	-1.2	+0.1	-0.4	402.1	X ^b
[C ₈ C ₁ Im][NTf ₂]	cation	-1.2	+0.1	-0.4	402.1	401.5
[N _{2,2,1,0}][TfO]	cation	-0.9	+0.1	-0.5	402.4	404.8
[N _{4,1,1,0}][HSO ₄]	cation	-1.0	+0.2	-0.5	402.2 ††	404.9

^a NP in column 7 indicates that no clear peak was observed in the N 1s NEXAFS spectrum for this ion.

^b X in column 7 indicates that the data have not been recorded.

* is used to differentiate the two anionic nitrogen atoms in [N(CN)₂]⁻.

† [C₈C₁Im][SCN] was used to obtain this E_B value.

†† [N_{8,1,1,0}][HSO₄] was used to obtain this E_B value.

The N 1s E_B is larger for [C_{*n*}C₁Im]⁺ than [X(CN)_{*y*}]⁻ (Table 1), indicating that [C_{*n*}C₁Im]⁺ has a more stable N 1s core orbital than [X(CN)_{*y*}]⁻. The implication is that the more stable orbital experiences a more positive (or less negative) charge. The sign of $q(N)$ cannot be unambiguously determined; only the relative difference between the environments can be determined. Crucially, the smallest experimental E_B difference between [C_{*n*}C₁Im]⁺ and the cyano nitrogen atoms in [X(CN)_{*y*}]⁻ is 1.9 eV. We have previously suggested that, owing to final state effects, differences in $E_B < 0.5$ eV should not be interpreted in terms of $q(A)$.²¹ Therefore, the difference of 1.9 eV is large enough to be assigned to differences in initial state effects, *i.e.* differences in $q(N)$.

There are excellent matches between literature data and both our NEXAFS spectroscopy and XPS data. Our N 1s XP spectra have approximately the same shape as those published in the literature, where available, *e.g.* [C_{*n*}C₁Im][N(CN)₂],^{34, 78, 79} [C_{*n*}C₁Im][NTf₂],^{34, 41, 80} and [C_{*n*}C₁Im][SCN]⁷³. When the E_B scales for the literature data are charge referenced using the same method as here, the N 1s E_B values for both cationic and anionic atoms matches our data, within experimental error, *e.g.* $E_B = 402.1 \pm 0.1$ eV for N_{cation} 1s for [C_{*n*}C₁Im][NTf₂]^{34, 41} and $E_B = 399.5$ eV for N_{anion} 1s for [C_{*n*}C₁Im][NTf₂]^{34, 41}. The only exception is the N 1s E_B value for [P_{6,6,6,14}][NO₃], which differs from the N 1s E_B value for [C₈C₁Im][NO₃] by 0.3 eV;⁴¹ such differences in E_B values for anionic atoms due to the identity of the cation have been rationalised in terms of differences in anion-to-cation charge transfer⁸¹. Our N 1s NEXAFS spectra have approximately the same shape as those published in the literature, where available, *e.g.* [C_{*n*}C₁Im][NTf₂]⁷⁵⁻⁷⁷ (further detail on comparison of NEXAFS spectra can be found in ref. ⁷⁴).

3.2. Computational Results

Calculated GP $q(\text{N})$ (averaged values) are provided in Table 1 and plotted in Figure 3 ($q(\text{N})$ for IL(SMD) are similar; ESI Table S4 and Figure S12). For the $[\text{X}(\text{CN})_y]^-$ anions, similar trends are found for all three $q(\text{N})$ assignment methods (AIM, NBO and ChelpG) for the cyano nitrogen atoms: $q(\text{N})$ is consistently slightly more negative for $[\text{SCN}]^-$ and $[\text{N}(\text{CN})_2]^-$ compared with $[\text{C}(\text{CN})_3]^-$ and $[\text{B}(\text{CN})_4]^-$ (both in the GP and IL(SMD)). A smaller $q(\text{N})$ for the larger anions (with more cyano groups) can be rationalised as the overall anion charge being spread over more cyano groups in $[\text{X}(\text{CN})_y]^-$ as y increases from $y = 1$ to $y = 4$.

$q(\text{N})$ for nitrogen atoms in the cations show the greatest differences between the three $q(\text{N})$ assignment methods (Figure 3). For example, for the cation in $[\text{C}_4\text{C}_1\text{Im}][\text{A}]$ the range of $q(\text{N})$ values is ~ 1.3 eV (from AIM to ChelpG), whereas for the anion in $[\text{C}_4\text{C}_1\text{Im}][\text{SCN}]$ the range of $q(\text{N})$ values is 0.7 eV (from AIM to NBO, Table 1). For all three cations studied computationally (*i.e.* $[\text{C}_4\text{C}_1\text{Im}]^+$, $[\text{N}_{2,2,1,0}]^+$ and $[\text{N}_{4,1,1,0}]^+$), $q(\text{N})$ are slightly positive for ChelpG, but $q(\text{N})$ are negative for both AIM and NBO (Figure 3).

$q(\text{N})$ for nitrogen atoms in the cations are essentially constant for different $[\text{C}_4\text{C}_1\text{Im}][\text{A}]$ ILs, *i.e.* independent of the anion, A (Table 1). This observation holds for all three $q(\text{N})$ assignment methods. For AIM $q(\text{N}) = -1.2$ e, for NBO $q(\text{N}) = -0.4$ e and for ChelpG $q(\text{N}) = +0.1$ e.

For both AIM and NBO, the values of $q(\text{N})$ are the same for both the cation and the anion in the $[\text{C}_4\text{C}_1\text{Im}][\text{X}(\text{CN})_y]$ ILs ($q(\text{N})_{\text{AIM}} \sim -1.2 \pm 0.1$ e and $q(\text{N})_{\text{NBO}} \sim -0.5 \pm 0.2$ e). For ChelpG, the values of $q(\text{N})$ for the cation and anion in the $[\text{C}_4\text{C}_1\text{Im}][\text{X}(\text{CN})_y]$ ILs are very different: $q(\text{N})_{\text{ChelpG}} \sim -0.6 \pm 0.1$ e for the anion and $q(\text{N})_{\text{ChelpG}} \sim +0.1 \pm 0.1$ e for cation.

For all of the ILs studied (apart from $[\text{C}_4\text{C}_1\text{Im}][\text{NO}_3]$) there is a clear difference in the magnitude of $q(\text{N})$ for the three different charge assignment methods used here. Of these methods, AIM gives the largest magnitude

$q(N)$ (*i.e.* highest charge polarisation). Such a difference is significant, and could lead to very different intermolecular interactions for ILs if AIM $q(N)$ were used for parameterising force fields for MD simulations.

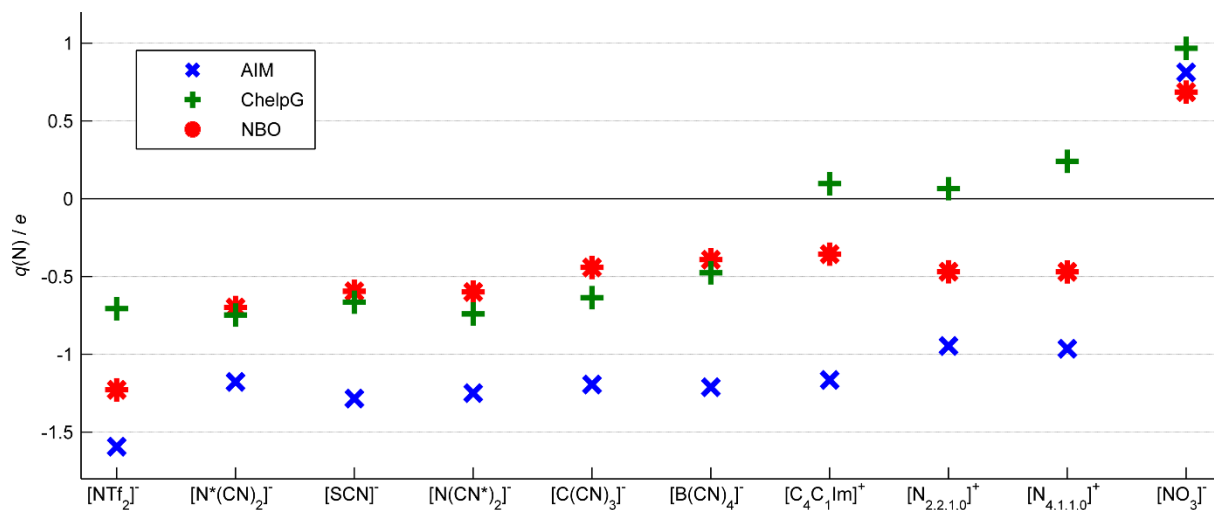


Figure 3. Average $q(N)$ values for all ions studied from ion pair (GP) calculations. * is used to distinguish between the two non-equivalent nitrogen atoms in $[N(CN)_2]^-$. For all anions, the counterion is $[C_4C_1Im]^+$; the $[C_4C_1Im]^+$ data point represents an average of all $[C_4C_1Im][A]$ ILs studied.

The range of $q(N)$ over the different conformers is shown for all systems in Figure 4. AIM and NBO $q(N)$ differ by $<0.1 e$ over all conformers, whereas ChelpG $q(N)$, as anticipated, exhibits a much larger conformational dependence of up to $0.3 e$ in some cases. Therefore, conformational effects are negligible for AIM and NBO $q(N)$, but can be significant for ChelpG $q(N)$.

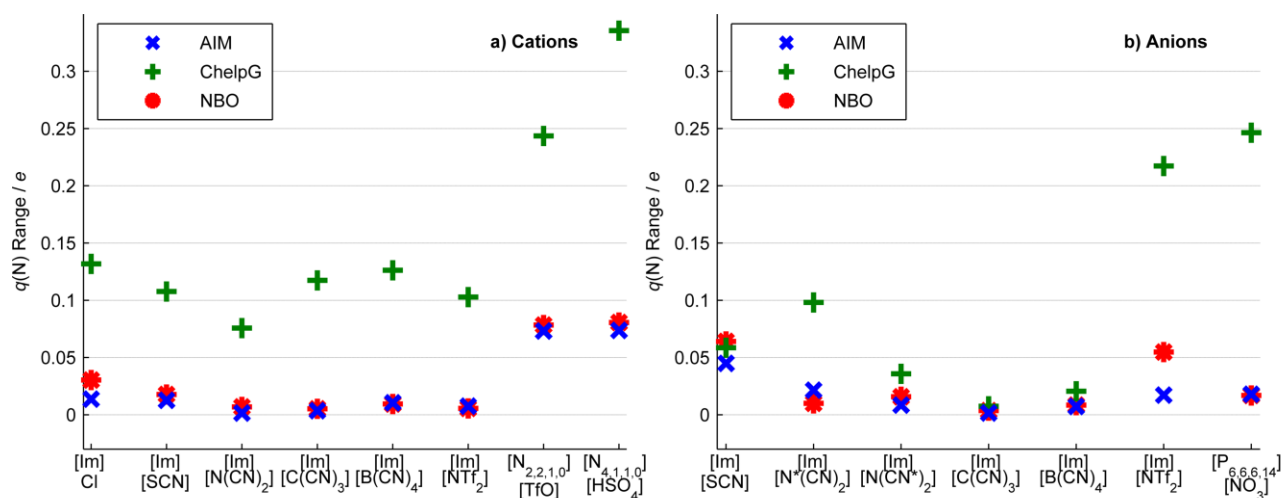


Figure 4. Range of calculated $q(N)$ between different conformers (the difference between the maximum and minimum $q(N)$ values for each IL) for a) nitrogen atoms in the cations and b) nitrogen atoms in the anions. All calculations were carried out on ion pair (GP) conformers. [Im]⁺ is used as shorthand for [C₄C₁Im]⁺.

The computed ChelpG $q(N)$ that show the largest range for the anion are [C₄C₁Im][NTf₂] and [P_{6,6,6,14}][NO₃], and for the cation are [N_{2,2,1,0}][TfO] and [N_{4,1,1,0}][HSO₄]. The standard deviation for respective averages (of all conformers) are 0.10 e , 0.08 e , 0.13 e and 0.12 e (for [C₄C₁Im][NTf₂], [P_{6,6,6,14}][NO₃], [N_{2,2,1,0}][TfO] and [N_{4,1,1,0}][HSO₄], respectively). These values are all in the region of 0.1 e .

The computed ChelpG $q(N)$ that show the largest range for the cation is found in [N_{2,2,1,0}][TfO] and [N_{4,1,1,0}][HSO₄]. Examining these structures, there are clear differences in the cation–anion association, which lead to a change in charge polarisation and ESP (Figure 5). For example, in [N_{2,2,1,0}][TfO], the higher-energy conformer ($q(N) = -0.1 e$) has a “free” protic N–H, with the nitrogen exposed on the exterior of the ion pair. By contrast, in the lowest-energy conformer ($q(N) = +0.2 e$) the protic N–H forms a H-bond with the oxygen atoms of the [TfO]⁻ anion; in this case, the nitrogen atom is buried within the ion pair.

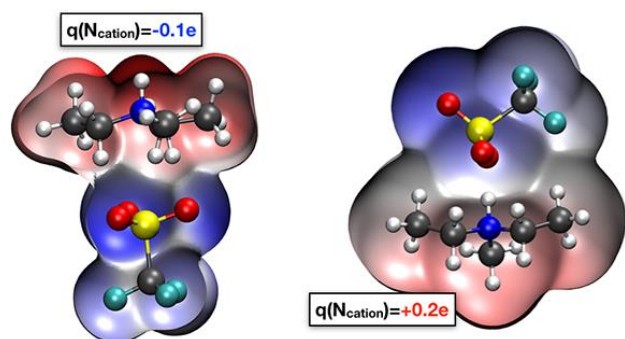


Figure 5. Two conformers of $[N_{2,2,1,0}][TfO]$ that show the largest variation in $q(N)$ for ChelpG; the density isosurface is computed at 0.004 au, and the ESP ranges from +0.1 e (red) through to -0.1 e (blue).

We tested the sensitivity of $q(N)$ to the addition of a solvent continuum model IL(SMD) (see ESI Tables S4 to S21). The difference in $q(N)$ between GP and IL(SMD) is $<0.1 e$ in most cases, and values had a maximum difference of $<0.2 e$. The lack of change in $q(N)$ on moving from the GP to an IL(SMD) solvent environment suggests that the electronic structure and ESP are not changing significantly. These results suggest that computational models that account for a greater degree of intermolecular interaction (*i.e.* clusters of ions) will not significantly change the calculated $q(N)$, consistent with our earlier study.²¹

3.3. Computational–Experimental Correlations

Calculated $q(N)$ data are plotted against N 1s E_B from XPS (Figure 6a) and N 1s E_{NEXAFS} from NEXAFS spectroscopy (Figure 6b). In both Figure 6a and Figure 6b a single data point is used for the $[C_4C_1Im]^+$ cation. The experimental data points were generated by averaging E_B values (and averaging E_{NEXAFS} values) of all $[C_nC_1Im][A]$ ILs studied.

Poor correlations are found between the calculated $q(N)$ and E_{NEXAFS} ($R^2 = 0.19, 0.30$ and 0.71 for NBO, AIM and ChelpG, respectively). A comparison of E_{NEXAFS} and $q(N)$ values for $[NO_3]^-$ and alkylammonium cations highlights how poorly NEXAFS spectroscopy performs for our dataset. All three $q(N)$ assignment methods used here give

very different $q(\text{N})$ values for $[\text{NO}_3]^-$ versus the two alkylammonium cations (see Table 1); for example, $q(\text{N})_{\text{ChelpG}} = +1.0 e$ for $[\text{C}_4\text{C}_1\text{Im}][\text{NO}_3]$ whereas $q(\text{N})_{\text{ChelpG}} = +0.2 e$ for $[\text{N}_{4,1,1,0}][\text{HSO}_4]$. However, E_{NEXAFS} for $[\text{NO}_3]^-$ and the two alkylammonium cations are the same (within experimental error). This poor performance is likely due to the very different UMOs (*i.e.* very different final state effects) for $[\text{NO}_3]^-$ and the two alkylammonium cations, which have a strong influence on the E_{NEXAFS} values. These poor correlations are anticipated based on our findings for sulfur atoms in ILs²¹ and the very different UMOs (*i.e.* very different final state effects) that occur for our structurally diverse nitrogen data set (for which we presented experimental evidence in Section 3.1). Therefore, the poor correlations are due to E_{NEXAFS} values giving a poor measure of $q(\text{N})$ (*i.e.* initial state effects) for our dataset of nine ILs. Consequently, we will not use E_{NEXAFS} values to draw conclusions on the quality of the different $q(\text{N})$ assignment methods for this IL dataset. However, NEXAFS spectroscopy can provide excellent insight into $q(\text{A})$ when the IL dataset studied contains only structurally very similar ions, *e.g.* when $q(\text{N})$ is probed for dialkylimidazolium-containing ILs (E_{NEXAFS} values for $[\text{C}_n\text{C}_1\text{Im}][\text{A}]$ ILs, along with E_{NEXAFS} for other ILs, will be considered in another publication).

Significantly better correlations are found between $q(\text{N})$ and E_{B} ($R^2 = 0.58, 0.72$ and 0.94 for NBO, AIM and ChelpG, respectively) than between $q(\text{N})$ and E_{NEXAFS} . We believe this finding is because E_{B} values are not influenced by the identity of the UMOs (unlike E_{NEXAFS} values). It is expected that the contribution of electron relaxation to the overall final state effects will be larger for E_{B} than for E_{NEXAFS} . However, for this particular dataset the final state effects are dominated by the identity of the UMOs. Overall, we believe that E_{B} values (rather than E_{NEXAFS} values) provide a superior measure of $q(\text{N})$ for this set of ILs.

The correlation between E_{B} and calculated (average) $q(\text{N})$ is best for the ChelpG values. This finding is in contrast to our earlier finding that NBO was the best method for calculating $q(\text{S})$.²¹ One possible reason why ChelpG $q(\text{N})$ correlate better with nitrogen E_{B} than sulfur E_{B} values is the relatively exposed nature of the nitrogen atoms in our current study, as opposed to the buried nature of sulfur atoms previously examined. The

major drawback of using ChelpG $q(N)$ is the non-physical conformational dependence observed for a small number of ILs.

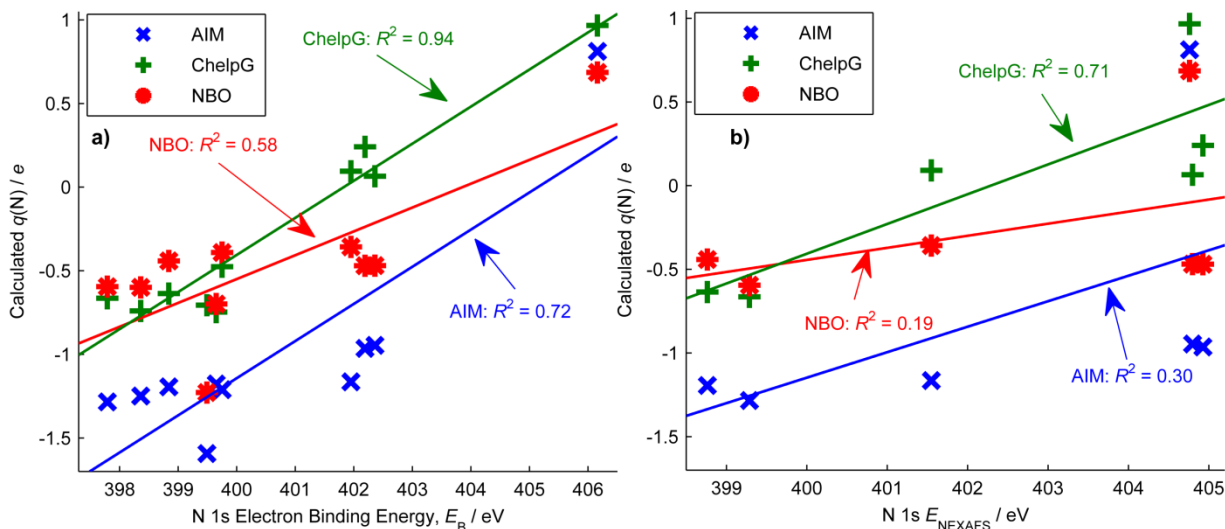


Figure 6. Calculated $q(N)$ data plotted against a) N 1s E_B from XPS and b) N 1s E_{NEXAFS} from NEXAFS spectroscopy. In both cases, a single data point is used for the imidazolium cation, which was generated by averaging values of all ILs studied (this value was $E_B = 401.9$ eV and $E_{\text{NEXAFS}} = 401.5$ eV). The slopes of linear regression lines (*i.e.* m in $y = mx + c$) are a) $m = 0.22$ (AIM), $m = 0.22$ (ChelpG), $m = 0.14$ (NBO) and b) $m = 0.30$ (AIM), $m = 0.18$ (ChelpG) and $m = 0.07$ (NBO).

A key difference between the computational methods (AIM, NBO and ChelpG) is the relative $q(N)$ assigned to nitrogen in the $[\text{C}_4\text{C}_1\text{Im}]^+$ cations versus the cyano nitrogen atoms in the $[\text{X}(\text{CN})_y]^-$ anions. In Section 3.1, we concluded from the XPS experiments that $q(N)$ for $[\text{C}_n\text{C}_1\text{Im}]^+$ is significantly more positive than for the cyano nitrogen atoms in $[\text{X}(\text{CN})_y]^-$. AIM gives $q(N)$ for $[\text{C}_4\text{C}_1\text{Im}]^+$ and $[\text{X}(\text{CN})_y]^-$ to be identical (for all four anions). For NBO $q(N)$ is the same for $[\text{C}_4\text{C}_1\text{Im}]^+$, $[\text{C}(\text{CN})_3]^-$ and $[\text{B}(\text{CN})_4]^-$. In contrast, ChelpG for all four ILs finds $q(N)$ for $[\text{X}(\text{CN})_y]^-$ to be negative (-0.5 e to -0.7 e) and $q(N)$ in $[\text{C}_4\text{C}_1\text{Im}]^+$ to be positive ($+0.1$ e to $+0.2$ e). The difference in $q(N)$ between $[\text{X}(\text{CN})_y]^-$ and $[\text{C}_4\text{C}_1\text{Im}]^+$, ~ 0.7 e, is significant, and agrees with the experimental E_B values (unlike for $q(N)$ from both AIM and NBO). Therefore, ChelpG was the only method to consistently assign a

significantly more positive charge for $[C_4C_1Im]^+$ nitrogen atoms compared with the cyano nitrogen atoms in $[X(CN)_y]^-$. Overall, ChelpG is the method with the best correlation to experiment.

Taking into account both the experimental (E_B values) and computational data (ChelpG) for $q(N)$, the relative ordering of charge on the nitrogen atom for these cations and anions is found to be (from most to least negatively charged) $[SCN]^- \approx [N(CN)_2]^- \approx [NTf_2]^- < [C(CN)_3]^- \approx [B(CN)_4]^- < [C_nC_1Im]^+ \approx [N_{a,b,c,0}]^+ < [NO_3]^-$. These values suggest that nitrogen carries significant negative charge in all the anions studied (except $[NO_3]^-$) and slight positive charge in the cations studied. The effect of the counterion on $q(N)$ was found to be negligible for $q(N)$ for $[C_nC_1Im][A]$ ILs, based on both E_{NEXAFS} values and calculated $q(N)$ for all methods. The lack of a counterion effect is consistent with previous results, and shows that intramolecular covalent interactions are the main factor determining $q(N)$ for imidazolium-based ILs.²¹

4. Conclusions

The focus of this paper is on understanding atomic charge assignment methods for ILs. N 1s XP spectra and N 1s NEXAFS spectra have been presented for a range of nine ILs. Computational data on $q(N)$ in the GP and within a IL(SMD) environment employing AIM, NBO and ChelpG charge assignment methods have been determined for these ILs.

We have demonstrated that XPS is a superior technique to NEXAFS spectroscopy for identifying initial state effects, and therefore $q(A)$, for a structurally diverse dataset of ILs. The final state effects observed using NEXAFS spectroscopy for a structurally diverse dataset of ionic liquids precludes its use for drawing conclusions on $q(A)$. However, NEXAFS spectroscopy can provide excellent insight into $q(A)$ when the IL dataset studied contains only structurally very similar ions.

ChelpG was determined to be the most suitable method for determining $q(A)$ in ILs, based on the good agreement of $q(A)$ with XPS E_B data for both nitrogen in the current study and sulfur in a previous study²¹. The excellent agreement between ChelpG $q(A)$ and XPS experimental data justifies the physical interpretation we make using ChelpG $q(A)$. Both AIM and NBO $q(A)$ assignment methods failed to correlate well with experimental E_B . ChelpG showed more significant conformational differences of up to 0.3 e ; therefore, we advise that small differences in ChelpG charges ($<0.3 e$) should be interpreted with care.

The overall charge $q(N)$ assigned to the two nitrogen atoms on the dialkylimidazolium cation are slightly positive using the ChelpG method; in contrast, both the AIM and NBO methods give negative $q(N)$. Based on our matches to experimental data, we tentatively conclude that the nitrogen atoms in the dialkylimidazolium cation are slightly positively charged. Furthermore, dialkylimidazolium $q(N)$ do not depend on the counterion identity, based on results from both $q(N)$ and NEXAFS spectroscopy.

5. Supplementary Material

See supplementary material for experimental methods and core-level X-ray photoelectron spectra, computational methods and results for IL(SMD), and conformers.

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