Flexibility is the key to tuning the transport properties of fluorinated imide-based ionic liquids†

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Ionic liquids are becoming increasingly popular for practical applications such as biomass processing and lithium-ion batteries. However, identifying ionic liquids with optimal properties for specific applications by trial and error is extremely inefficient since there are a vast number of potential candidate ions. Here we combine experimental and computational techniques to determine how the interplay of fluorination, flexibility and mass affects the transport properties of ionic liquids with the popular imide anion. We observe that fluorination and flexibility have a large impact on properties such as viscosity, whereas the influence of mass is negligible. Using targeted modifications, we show that conformational flexibility provides a significant contribution to the success of fluorination as a design element. Contrary to conventional wisdom, fluorination by itself is thus not a guarantor for beneficial properties such as low viscosity.

Introduction

Room temperature ionic liquids have moved up from a scientific curiosity to widespread use across science and technology.1–6 However, the realisation of these applications often faces obstacles, and the plateau of productivity is not yet reached.7–10 The main reason for this is the vast chemical space of all possible ionic liquids which rules out purely empirical selection criteria, making it difficult to choose an ionic liquid for a specific application.11–14 Ionic liquids are in general expensive and often difficult to work with, which further limits the number of candidates that can be explored. It is thus desirable to identify general concepts and design elements from a purposefully selected subset of ionic liquids.15–18 Such design elements would provide invaluable shortcuts when choosing an ionic liquid, reducing the need for empirical study to only a few promising candidates.

The high viscosity of most ionic liquids presents a major challenge for practical applications.19,20 In this regard, ionic liquids are different to classical molecular solvents.19,20 A high viscosity complicates practical handling and slows down other transport properties such as electrical conductivity or diffusion. This reduces the performance of devices when ionic liquids are used, for example in lithium-ion batteries or organic solar cells. Hence, design elements which can influence the viscosity – and transport properties in general – are of critical importance.

Traditionally, design elements are identified in form of ‘structure–property relationships’.21–25 This means that changes to the molecular structure of an ionic liquid (such as the length of an alkyl side chain) are correlated with changes observed in the properties (such as the viscosity). However, this approach is often flawed by confounding variables. For example, changing the length of an alkyl side chain will have impacts on flexibility, mass, volume, and dispersion interactions. Instead, it is...
desirable to aim for targeted modifications, i.e. well defined changes to just one isolated variable. Where this is not possible, it is advisable to at least consider the potential impact of confounding variables.

In this work, we will focus on targeted modifications of the popular bis(trifluoromethylsulfonyl)imide [NTf2]− anion, which was introduced by Bonhôte et al. in 1996. Ionic liquids with this anion are now widely used as they generally have beneficial properties such as low melting points and low viscosities. These beneficial properties are commonly attributed to the high degree of fluorination and the conformational flexibility of the [NTf2]− anion. The high degree of fluorination leads to delocalisation of the negative charge, thus reducing the basicity and coordination tendency of the anion. The conformational flexibility of the [NTf2]− anion is due to the presence of two conformers, trans and cis, Fig. 1. These conformers are separated by a small barrier, hence the [NTf2]− anion is able to change shape quickly.

The CF3 groups are relatively large, and rotation around the N-S bonds requires significant sweep volume. Hence, changes in conformation also change the shape of the [NTf2]− anion significantly. In the ionic liquid, such bulky imide anions move by ‘slithering’ through the little free space available; however, this interpretation is currently debated. Accordingly, conformational flexibility is not relevant for anions which have small side groups and thus little sweep volume, such as the bis(fluorosulfonylimide) [NFs2]− anion. We have previously demonstrated the importance of conformational flexibility by comparing two ionic liquids with similar anions, 1-butyl-3-methylimidazolium acetyl(trifluoromethylsulfonylimide) ([C4C1im][NTfAc]) and 1-butyl-3-methylimidazolium (methylsulfonyl)(2,2,2-trifluoroacetyl) imide ([C4C1im][NMsTFA]). In this work, we study several targeted modifications of [C4C1im][NTf2] with a broad range of theoretical and experimental methods. In doing so, we are able to disentangle the effects of fluorination and conformational flexibility and provide a consistent picture of the relative importance of these design elements.

Detailed understanding of the effects of anion fluorination will enable the design of novel anions with similar or better performance in the future. This is especially important in the light of recent reports indicating that some fluorinated anions are persistent environmental contaminants. The insights in this work provide a starting point for the research on novel anions with lowered fluorine content without having to compromise on ionic liquid performance.

Materials and methods

Ab initio simulations

Full computational details can be found in the literature, previously unpublished results are given in the ESI. The Gaussian 09 software package was used for the ab initio simulations in this work. Symmetry processing was bypassed for all calculations. The SCF convergence criterion was set to at least 10−9 on the density matrix and 10−7 on the energy. A pruned integration grid with 99 radial shells and 590 angular points per shell was used. Two-dimensional potential energy scans were performed at the MP2/cc-pVTZ//B3LYP-GD3BJ/6-311+G(d,p) level of theory. All electrons were included for the single point energies of stationary points (full MP2), whereas only valence electrons were used for the 2D potential energy surface scans (frozen core MP2) to save computational time. Volumes were calculated for the minimum energy conformer using the Multiwfn software package. The grid point spacing for the volume analysis was 0.15 bohr, with the wavefunction at the B3LYP-GD3BJ/6-311+G(d,p) level of theory with SCF convergence tightened to 10−10 on the density matrix and 10−8 on the energy.

Physicochemical properties

Physicochemical properties were measured as described previously. Consistency of the physicochemical characterization with literature data was confirmed for [C4C1im][NTf2] and showed good agreement, see ESI. Prior to all chemical measurements, the ionic liquids were dried in high vacuum with stirring for at least two days and handled using Schlenk techniques, glove box and NMR port. Information about water content is given in the ESI.

Thermal transitions

Thermal behaviour of the investigated ionic liquids in the range of 153 to 393 K was investigated by differential scanning calorimetry (DSC) on a DSC 1 STARé (Mettler Toledo, Germany) equipped with a liquid nitrogen cooling system. For the measurement, approximately 10 mg of the sample were weighed into an aluminium crucible inside a glove box and the filled crucible was then hermetically sealed. The sample was then subjected to heating from 298 to 393 K with a heating rate of +1 °C min−1, followed by a 5 min isothermal step at 393 K to remove thermal history of the sample. The samples were then

Fig. 1 Schematic of the two minimum energy conformers of the [NTf2]− anion, and of the energy as a function of the C-S···S-C dihedral angle. Adapted from ref. 39.
cooled to 153 K with a cooling rate of $-1 \, ^\circ\text{C min}^{-1}$, followed by a 5 min isothermal step and heating to 298 K with $+1 \, ^\circ\text{C min}^{-1}$. Glass transitions were determined using the midpoint methods, while the other thermal events are given as the peak maximum.

**Viscosity**

Shear dependent viscosity $\eta$ was measured on a Physica MCR301 rheometer (Anton Paar, Austria) on a vibration isolated table using a setup with cone-plate geometry. The cone had a nominal diameter of 49.95 mm and a distance between its tip and the plate of 0.101 mm. All measurements were conducted under nitrogen atmosphere to avoid water uptake. After thermal equilibration the viscosities of the samples were measured by applying 30 different shear rates from 5 to 80 s$^{-1}$ with linear spacing. For each shear rate the data over 15 seconds was averaged. As ionic liquids at all temperatures showed no shear rate dependence (Newtonian fluid behaviour), the results for each measured temperature were averaged. The temperature dependent viscosity curves were constructed by repeating this procedure in 5 K steps from 298.15 K to 378.15 K. Maximum temperature deviation during the measurements was $\pm 0.01$ K. The uncertainty of the viscosity values is $\pm 1.5$% as estimated from multiple measurements of the same sample, comparison to literature values and temperature dependent viscosity standards.

**Molecular dynamics simulations**

Polarisable MD simulations were run using the LAMMPS$^{59}$ software package, version 7 Aug 2019, tdamp branch (the temperature grouped Nosé–Hoover thermostat (tgnNH) is available in the USER-DRUDE package since version 24 Dec 2020).$^{59-61}$ We used the CLkPol/TG-NH force field as described previously,$^{24-25}$ with the standard force field parameters for the $[C_2C_1im]^+$ cation and the $[NTf_2]$ anion.$^{56-58}$ The procedure of force field extension to $[CHTf_2]$ anion is described in ESI.$^\dagger$ The initial LAMMPS data files were created using ftool (https://github.com/paduagroup/ftool) and Packmol$^\text{™}$ with 512 cations and 512 anions in a periodic cubic box, explicit polarisation effects were introduced using polariser and scaleJ scripts (https://github.com/paduagroup/clandpol). Details on the simulation setup are given in the ESI.$^\dagger$

The prealpha software package was used for processing of the trajectory and for the calculation of the intermittent dihedral autocorrelation function, the mean squared and mean quartic displacements, rotational autocorrelation functions, charge arm distributions, and conformer distribution histograms. Source code, executable, input files and manual are available on Github (https://github.com/FPhilippi/prealpha).

SAXS patterns have been calculated using the TRAVIS software package, code version Jan 01 2019.$^{59-61}$ The dynamic charge–charge correlation structure factor $S_{\text{charge}}(k)$ is utilised to characterise relaxation dynamics in the ILs, and the details of this calculation are provided in ESI.$^\dagger$ The code for dynamic charge–charge correlation structure factors is available on Github (https://github.com/jmcdaniel143/Structure_factor_FFT).

**Results and discussion**

**Overview of targeted modifications**

In this work we use targeted modifications of the $[NTf_2]^{-}$ anion as a base structure to investigate the influence of conformational flexibility, fluorination, and mass. The targeted modifications are all accessible synthetically and are summarised in Fig. 2.

The geometry of the $[NTf_2]^{-}$ anion can be defined by two C-S-N-S dihedral angles, describing the rotation around each of the N-S bonds. The corresponding potential energy surface (PES) as a function of these two dihedral angles is shown in Fig. 3a. There are two unique minima, corresponding to the *trans* and *cis* conformers. For better comparison, we will use a threshold of 15 kJ mol$^{-1}$ (shown as dotted lines) to define thermally accessible regions in the PES in this work.

The $[CHTf_2]^-$ anion, Fig. 2a, is known as an intermediate in the synthesis of $[CTf_2]^-$, which is used as ligand in catalysis.$^{62,63}$ We have previously investigated ionic liquids of $[CHTf_2]^-$ paired with ammonium and phosphonium cations.$^{45}$ Compared with the imide anion $[CHTf_2]^-$, the methanide central group in $[CHTf_2]^-$ leads to a much more rigid anion.$^{39}$ Thus, the barriers in the PES, Fig. 3b, are much higher for $[CHTf_2]^-$ compared to $[NTf_2]^{-}$, and changes in the properties of the corresponding ionic liquids can be traced back to their different conformational flexibility.

The two anions $[NTfAc]^{-}$ and $[NMsTFA]^{-}$, Fig. 2b, have the same sum formula and thus identical molecular weight. The different relative position of the CH$_3$ and CF$_3$ groups alone lead to a difference in conformational flexibility, see the PES in Fig. 3c and d. Thus, these two anions are ideally suited as targeted modifications to experimentally investigate the effects of conformational flexibility.

Fig. 2c shows a systematic series of anions with increasing degree of fluorination, from the non-fluorinated $[NMs]^{-}$ over the asymmetric, half fluorinated $[NTfMs]^{-}$ to the fully fluorinated $[NTf_2]^{-}$. Fluorination changes several characteristics of the anions, the most obvious change is the increase in mass and volume. More subtly, the conformational flexibility increases with fluorination as well, see the PES in Fig. 3a, e and f.

Finally, we also investigate a series of fully fluorinated anions, Fig. 2d. The three acyclic anions $[NFS]^{-}$, $[NTf]^{-}$, and $[NPf]^{-}$ have similar conformational flexibility, the main difference is again mass and volume. In contrast, the 6-membered cyclic perfluoroalkylbis(sulfonyl)imide anion [6cPFSI] is covalently locked into the *cis* conformer.$^{46}$ Hence, this anion serves as a reference without conformational flexibility, as no conversion into the *trans* conformer is possible.

The corresponding ionic liquids with the 1-butyl-3-methylimidazolium ([C$_4$C$_1$im]$^+$) cation have been prepared as part of this work. Where necessary, the required anion precursors have been synthesised as well; details can be found in the ESI.$^\dagger$ Specifically, we developed improved procedures for the synthesis of H[NTfAc] and H[NMsTFA], [C$_4$C$_1$im]$^+$ was chosen as one of the most widely used cations in ionic liquids research to date. The ionic liquid $[C_2C_1im][NTf_2]$ is particularly well
characterised and has been the subject of numerous diverse studies. A comparison of our physicochemical data for \([\text{C}_4\text{C}_1\text{im}][\text{NFs}_2]\) to the literature is provided in the ESI† to demonstrate reliability and reproducibility of our experimental setup.

The anions in Fig. 2 are very similar. Hence, we decided to include \([\text{C}_4\text{C}_1\text{im}][\text{B(CN)}_4]\) for comparison. This ionic liquid (with the tetracyanoborate anion) is similar to \([\text{C}_4\text{C}_1\text{im}][\text{NTf}_2]\) in the sense that both ionic liquids are hydrophobic (but hygroscopic) and show comparable behaviour experimentally, including in their syntheses. The volume of the \([\text{B(CN)}_4]\) anion is in between those for \([\text{NFs}_2]\) and \([\text{NTf}_2]\), and all three anions are weakly coordinating.† The crucial difference is that \([\text{B(CN)}_4]\) only possesses one conformer, which will be valuable to discuss this work in a larger setting.

Crystals suitable for X-ray crystallography were grown for several of the anions and their corresponding free acids, details are provided in the ESI.† Crucially, the crystal structures provide experimental values for the conformation of the anions. The corresponding experimental dihedral angles extracted from the crystal structures are shown as circled crosses in Fig. 3. The agreement between theory and experiment is excellent; see also the ESI† for a numerical comparison. This shows that our gas phase ab initio calculations indeed provide reliable predictions. In addition, the solid state is in general more affected by specific intermolecular interactions and packing effects than the liquid state. Hence, it is likely that the ab initio predictions are relevant for the liquid, where thermal sampling of the PES is less restricted than in the solid.

The non-fluorinated ionic liquid \([\text{C}_4\text{C}_1\text{im}][\text{NMs}_2]\) showed remarkable supercooling, and remained liquid for months at room temperature, approximately 30 °C below the melting point. Physicochemical characterisation in the supercooled state was also possible without encountering solidification.

However, once crystallised, the solid could be used as a seed to initiate nucleation in an independently synthesised sample of \([\text{C}_4\text{C}_1\text{im}][\text{NMs}_2]\) which was also obtained as supercooled liquid. A crystal structure of \([\text{C}_4\text{C}_1\text{im}][\text{NMs}_2]\) could thus be recorded. The \([\text{NMs}_2]\) anion is known to form stronger hydrogen bonds than its fluorinated counterpart, \([\text{NTf}_2]\). Nevertheless, only weak hydrogen bonds were observed in the crystal structure, see ESI†.

**Factors affecting the viscosity**

The transport properties are not independent; low viscosities correlate with fast diffusion and high conductivity. A detailed discussion of all our available physicochemical data would by far exceed the scope of this work. Hence, we will focus on viscosities as the central transport property. Diffusion coefficients and electrical conductivities are given in the ESI† and will be discussed in a separate publication. We have furthermore recorded \(^1\text{H}\) and \(^19\text{F}\) NMR relaxation profiles via Fast Field Cycling (FFC) at different temperatures (which give access to rotational and translational relaxation times) and pressure dependent diffusion coefficients; these results are far beyond the scope of this work and will also be published separately.

An overview of the ionic liquids in this work, their characteristics and experimental viscosities is given in Table 1. The flexibility of the anion was judged qualitatively based on their PES. Here, an anion is considered flexible if its conformers are not separated by barriers larger than 15 kJ mol\(^{-1}\). The anion volumes were calculated from the electron density in the gas phase, which is sufficient as relative measure. In the following, the ionic liquids will be discussed according to their group, see also Fig. 2.

We have previously observed that the viscosities of ionic liquids with the rigid \([\text{CHTf}_2]\) anion are significantly higher than those with the flexible \([\text{NTf}_2]\) anion. Specifically, across...
Fig. 3 Potential energy surfaces of (a) \([\text{NTf}_2]^-\), (b) \([\text{CHTf}_2]^-\), (c) \([\text{NTfAc}]^-\), (d) \([\text{NMsTFA}]^-\), (e) \([\text{NTfMs}]^-\), (f) \([\text{NMs}_2]^-\). Crosses indicate experimental dihedral angles obtained from crystal structures, red for anions and yellow for their corresponding free acids. See ESI† for details, and CSD deposition number 236629 and 236630 for \([\text{NTf}_2]^-\). Long dashed lines enclose the symmetrically unique region. The 15 kJ mol\(^{-1}\) isolines are drawn with black dots.
different phosphonium and ammonium ionic liquids, the relative increase in viscosity at room temperature was between 2 and 3.\textsuperscript{45} For the imidazolium ionic liquids in this work, the viscosity increased by a factor of 3, from 51 mPa s for [C\(_4\)C\(_1\)im][NTf\(_2\)] to 153 mPa s for [C\(_4\)C\(_1\)im][CHTf\(_2\)]. Hence, the dynamics of these two systems are clearly affected by conformational flexibility. The well-known [C\(_4\)C\(_1\)im][NTf\(_2\)] ionic liquid has the additional advantage that carefully parameterised classical force fields are available.\textsuperscript{55–57} Hence, group (a) was chosen to further investigate the structural relaxation by means of MD simulation, which will be presented further below.

The ionic liquids in group (b), [C\(_4\)C\(_1\)im][NTfAc] and [C\(_4\)C\(_1\)im][NMsTFA], have already been discussed in our preliminary work on conformational design concepts.\textsuperscript{49} Briefly, the viscosity increases by a factor of two from the ionic liquid with the flexible anion to that with the rigid anion. It is worth noting that we independently synthesised new samples using our improved synthesis route and repeated the physicochemical measurements. The values in Table 1 differ from those previously reported by less than 2%, thus our measurements on these novel ionic liquids are reproducible.

The viscosity at room temperature increases by a factor of 3.4 from [C\(_4\)C\(_1\)im][NTf\(_2\)] to [C\(_4\)C\(_1\)im][NTfMs], and by a factor of 7.2 from [C\(_4\)C\(_1\)im][NTfMs] to [C\(_4\)C\(_1\)im][NMs2], see the black arrows in Fig. 4. Both higher flexibility and lower basicity are expected to contribute to low viscosities, which explains the great changes in viscosity within group (c). For comparison, Fig. 4 also shows the two half-fluorinated ionic liquids [C\(_4\)C\(_1\)im][NTfAc] (red curve) and [C\(_4\)C\(_1\)im][NMsTFA] (blue curve) from group (b). These two ionic liquids only differ in conformational flexibility, see the red arrow in Fig. 4. In contrast, the changes in viscosity corresponding to the black arrows contain contributions from both flexibility and basicity. A quantitative comparison is not meaningful due to the relatively crude approximations, however Fig. 4 shows that conformational flexibility and basicity are equally important.

The changes in size are much larger in group (d) compared to group (c). From [C\(_4\)C\(_1\)im][NFs2] to [C\(_4\)C\(_1\)im][NTf\(_2\)], the anion molecular weight increases from 180 g mol\(^{-1}\) to 280 g mol\(^{-1}\), which leads to an increase in viscosity by a factor of 1.5. The increase in anion molecular weight is similar from [C\(_4\)C\(_1\)im][NMs2] (172 g mol\(^{-1}\)) to [C\(_4\)C\(_1\)im][NTf\(_2\)], but the viscosity decreases 25-fold, hence we have previously neglected the influence of size. However, since basicity and conformational flexibility do not change considerably in the series [NFs2]\(^{-}\)–[NTf\(_2\)]\(^{-}\)–[NPf\(_2\)]\(^{-}\), size becomes more important in comparison.

Table 1 Overview over the ionic liquids in this work and their properties. [C\(_4\)C\(_1\)im][NTf\(_2\)] belongs to several groups and is shown more than once.

| Group | Ionic liquid | CAS       | Anion flexibility | \(M(\text{anion})/\text{g mol}^{-1}\) | \(V(\text{anion})/\text{Å}^3\) | \(\eta^{25 \degree \text{C}}/\text{mPa s}\) |
|-------|--------------|-----------|-------------------|-------------------------------------|-------------------------------|---------------------------------|
| (a)   | [C\(_4\)C\(_1\)im][NTf\(_2\)] | 174899-83-3 | Flexible          | 280                                 | 210                           | 51                             |
|       | [C\(_4\)C\(_1\)im][CHTf\(_2\)] | 1005735-46-5 | Rigid             | 279                                 | 217                           | 135                            |
| (b)   | [C\(_4\)C\(_1\)im][NTfAc]  | 2486007-65-0 | Flexible          | 190                                 | 174                           | 147                            |
|       | [C\(_4\)C\(_1\)im][NMsTFA]  | 2486007-63-8 | Rigid             | 190                                 | 175                           | 288                            |
| (c)   | [C\(_4\)C\(_1\)im][NMs2]  | 945611-32-5 | Rigid             | 172                                 | 178                           | 1256                           |
|       | [C\(_4\)C\(_1\)im][NTfMs]   | —          | Intermediate      | 226                                 | 194                           | 175                            |
|       | [C\(_4\)C\(_1\)im][NTf\(_2\)] | 174899-83-3 | Flexible          | 280                                 | 210                           | 51                             |
| (d)   | [C\(_4\)C\(_1\)im][NFs2]  | 1235234-58-8 | Flexible          | 180                                 | 143                           | 33                             |
|       | [C\(_4\)C\(_1\)im][NTf\(_2\)] | 174899-83-3 | Flexible          | 280                                 | 210                           | 51                             |
|       | [C\(_4\)C\(_1\)im][NTfMs]  | 1201362-14-2 | Rigid             | 292                                 | 213                           | 172                            |
|       | [C\(_4\)C\(_1\)im][NPf\(_2\)] | 254731-29-8 | Flexible          | 380                                 | 274                           | 116                            |
|       | [C\(_4\)C\(_1\)im][B(CN)\(_4\)] | 742099-78-1 | Rigid             | 115                                 | 156                           | 31                             |
The increase in viscosity from [C₄C₁im][NTf₂] to [C₄C₁im][NPf₂] (by a factor of 2.3) is larger than that from [C₄C₁im][NFs₂] to [C₄C₁im][NTf₂] (by a factor of 1.5), which might be due to the onset of fluorous domain formation.⁷⁰-⁷⁴

The cyclic anion [6cPFSI]⁻ (M = 292 g mol⁻¹) is only marginally heavier than the acyclic [NTf₂]⁻ (anion M = 280 g mol⁻¹). Yet, the viscosity of [C₄C₁im][6cPFSI] is 3.4 times higher than that of [C₄C₁im][NTf₂], exceeding even the viscosity of [C₄C₁im][NPf₂], Fig. 5. The higher viscosity arises due to the cyclic, rigid structure of [6cPFSI]⁻. This observation shows the relative importance of conformational flexibility in this anion class (red arrow in Fig. 5), which has a larger impact on the viscosity than the change in size (black arrows in Fig. 5) when two CF₂ groups are introduced to the side chain. The experimental evidence clearly shows the importance of conformational flexibility, on a par with the direct effects of anion fluorination. It is thus interesting to consider the [C₄C₁im][B(CN)₄] ionic liquid which we included to discuss our results in the broader frame of ionic liquids in general. The viscosities of [C₄C₁im][B(CN)₄] and [C₄C₁im][NFs₂] are very similar, the [B(CN)₄]⁻ anion has a slightly larger volume and slightly lower mass than the [NFs₂]⁻ anion. This similarity is surprising, given the very different structures of the two anions, especially with the [B(CN)₄]⁻ anion only having one conformer. Two explanations appear viable. First, the [NFs₂]⁻ anion is so small that its (high) conformational flexibility loses relevance – in line with the sweep volume and slithering hypotheses.²⁵,²⁶,²⁹ Second, specific pathways of structural relaxation might be present with the [B(CN)₄]⁻ anion.

### DMTA measurements

Dynamic mechanical thermal analysis (DMTA) is a well known technique to study the structural relaxation behaviour of bulk materials, see the ES† for more details of the technique, analysis, and results. Fig. 6 shows the DMTA spectrum of [C₄C₁im][NTf₂] as a prototypical example. The observed thermal transitions showed excellent agreement between DMTA and DSC measurements. The relative variation of the storage modulus E’ on cooling increases significantly during vitrification (around –90 °C) while on heating back it increases at the cold crystallisation (around –50 °C), and decreases on further heating during melting (around 0 °C).

Two peaks are visible in the cooling curve of the loss tangent, tan δ, see Fig. 7 for measurements at different frequencies. The narrow peak around –90 °C does not change with frequency and corresponds to the glass transition. The signatures of glass transition, cold crystallisation, and melting transition were indeed frequency independent as expected. Critically, dynamic relaxation leads to a thermally activated peak in the loss tangent which shifts to higher temperature with increasing frequency, f, of the oscillating deformation. Thus, the broad peaks in Fig. 7 are the signature of a thermally activated relaxation process similar to those already reported, including components related to viscous flow.²⁶,²⁸ Furthermore, the intensity is higher for those peaks at higher temperature/larger f, suggesting the occurrence of relaxation is dominated by a two state process whose energy difference ΔE must be larger than zero in this case.²⁸

Viscous flow is a complex, collective process which involves transitions between minimum energy configurations on the global PES of the liquid. The observed relaxation can be described using a simplified, two state model; i.e. the rate-limiting ‘elementary reaction’ is the thermally activated transition between two states. Such a state may be a well-defined minimum energy configuration, or a collection of minimum energy configurations separated by small energy barriers. Many configurations – and even more transitions between them – are accessible in a liquid, and conformational flexibility is not the

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**Fig. 5** Viscosity as a function of temperature for ionic liquids of group (d). The symbols are colour coded following the fluorine content. The red arrow corresponds to the increase in viscosity due to loss of conformational flexibility in the cyclic anion, the black arrows correspond to the viscosity change as a result of fluorination (not including conformational flexibility). Drawn lines are a guide to the eye.

**Fig. 6** Representative DMTA spectrum of [C₄C₁im][NTf₂]. Black arrows correspond to the thermal transitions obtained from DSC measurements. Here, f = 10 Hz, heating (empty symbols) rate and cooling (solid symbols) rate 4 K min⁻¹.
only pathway to viscous flow and structural relaxation. However, the simple model works well where other contributions are negligible compared to conformational flexibility. In this case, conformational flexibility becomes the main contribution to the height of the energy barrier between the two states. Accordingly, negligible compared to conformational flexibility.

Table 2: DMTA results, obtained from simultaneous fits of the thermally activated peaks in the DMTA spectra of the ionic liquids in this work. See ESI for further details. The energy differences ΔE from the ab initio simulations are given in italic in the third column.

| Ionic liquid | ΔE/kJ mol⁻¹ | τ/μs | W/kJ mol⁻¹ |
|--------------|-------------|------|------------|
| [C₄C₁im][NTf₂] | 2.6(3) | 3.5 | 1.6(2) × 10⁻¹³ | 31(1) |
| [C₄C₁im][NTfAc] | 1.6(2) | 1.7 | 1.7(2) × 10⁻¹³ | 40(1) |
| [C₄C₁im][NMsTFA] | 12(4) | 12.0 | 4.0(1) × 10⁻¹³ | 41(1) |
| [C₄C₁im][NMsTFA] | 4.1(5) | — | 4.0(1) × 10⁻¹³ | 47(1) |
| [C₄C₁im][NMs] | — | 15 | 2.2 | 35(4) |
| [C₄C₁im][NMs] | 4.7(2) | 1.5 | 2.3(5) × 10⁻¹³ | 46(1) |
| [C₄C₁im][B(CN)₄] | 0 | — | 2.4(9) × 10⁻⁶ | 2.3(1) |

* Additional GS at 12.4 kJ mol⁻¹.
timescale of diffusive processes, see ESI.† For the imide ionic liquids, \( \tau_0 \) was on the order of tenths of picoseconds, which is roughly the timescale of the fast intramolecular conformational dynamics, cf. Fig. 13. In general, \( \tau_0 \approx 10^{-14} \) s are typical for viscous liquids near the glass transition.\cite{38,78,79} Furthermore, the analysis of the DMTA spectrum revealed that the relaxation in \( [\text{C}4\text{C}1\text{im}][\text{B(CN)}_4] \) involved two sites of identical energy, separated by a very small barrier of 2.3 kJ mol\(^{-1}\). Hence, the mechanism dominating the dynamics in \( [\text{C}4\text{C}1\text{im}][\text{B(CN)}_4] \) is likely intermolecular in nature.

We have previously highlighted the similarities of \( [\text{C}4\text{C}1\text{im}][\text{B(CN)}_4] \) and \( [\text{C}4\text{C}1\text{im}][\text{NFs}_2] \). Indeed, we were unable to analyse the DMTA spectrum of \( [\text{C}4\text{C}1\text{im}][\text{NTf}_2] \), in contrast to \( [\text{C}4\text{C}1\text{im}][\text{NFs}_2] \). The fluorine and oxygen atoms in the \( [\text{NFs}_2]^- \) anion are of comparable size, thus there is little possibility for coupling between structural relaxation and conformational reorganisation. This finding further corroborates the sweep volume and slithering hypotheses.\cite{35,36,39} Thus, it becomes clear why some anions such as \( [\text{B(CN)}_4]^- \), but also \( [\text{BF}_4]^- \) or \( [\text{PF}_6]^- \) lead to ionic liquids with reasonably fast transport properties, despite the absence of conformational dynamics. These ions are by themselves comparable in size to the triflate groups in \( [\text{NTf}_2]^- \). Similarly, it can be expected that the impact on transport properties would be small if the \( [\text{NFs}_2]^- \) anion were rigid, since its sweep volume is small as well.

**MD simulations: \( [\text{C}4\text{C}1\text{im}][\text{NTf}_2] \) vs. \( [\text{C}4\text{C}1\text{im}][\text{CHTf}_2] \)**

Atomistic MD simulations offer further, molecular-level insight into dynamics. Hence, we decided to investigate the impact of conformational flexibility in imide ionic liquids on key dynamic quantities obtained from statistical mechanics. We will use (auto)correlation functions which statistically quantify how fast an ensemble of molecules transitions from an initial state (such as a certain orientation) to a random distribution. The faster this transition, the lower the corresponding lifetime. The two

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**Fig. 8** Potential energy surfaces of (a) \( [\text{NTfAc}]^- \) and (b) \( [\text{NMSTFA}]^- \), red arrows indicate plausible transitions between basins in line with the DMTA measurements.

**Fig. 9** The two unique minimum energy geometries in \( [\text{NMSTFA}]^- \), cf. Fig. 8b.

**Fig. 10** The three unique minimum energy geometries in \( [\text{NMsTFA}]^- \). The nitrogen atom points out the back of the paper plane. The two cis conformers are geometrically very similar, but not enantiomers.
ionic liquids from group (a), [C₄C₅im][NTf₂] and [C₄C₅im][CHTf₂], were chosen for this purpose as reliable force fields to current standards were readily available.

A common approach to probe liquid structure is Small Angle X-ray Scattering (SAXS). The simulated SAXS pattern is shown in Fig. 11, black curve. Three features are generally observed.⁸⁰⁻⁸⁵ The peak at 1.36 Å⁻¹ corresponds to adjacency correlations, i.e. neighbouring atoms, and is present in molecular liquids as well.⁹⁶ The shoulder at 0.49 Å⁻¹ corresponds to long-range correlations, e.g. due to nanosegregation into polar and apolar domains.⁹⁹,¹¹,¹⁵ Within this work, the intermediate peak at 0.86 Å⁻¹ is most relevant. This ‘charge peak’ is a signature of the characteristic charge network in ionic liquids, though it might be suppressed due to systematic cancellations even if a charge network is present.⁹¹,²⁸,⁶⁷ Recent work has shown that the relaxation of the charge network is closely related to viscous flow.⁷⁸⁻⁹¹

The charge network of ionic liquids is better characterised by the charge correlation structure factor $S_{\text{charge}}$, which is related (through linear response theory) to the dielectric properties of the electrolyte.⁹⁴ Such charge correlation is often difficult to infer from SAXS patterns, as the X-ray scattering cross section of an atom/molecule is dictated by the total electron density rather than net charge. It has been previously shown that peaks in $S_{\text{charge}}$ are distinctly different for ILs that exhibit different properties.⁹³ In this work, we use a simplified charge correlation structure factor which is calculated using only the positions of the centre of charge for each molecular ion, rather than atomic charges. Thus, we obtain $S_{\text{charge}}$ in a way which is characteristic for the intermolecular charge network. Fig. 11 compares the charge correlation structure factor $S_{\text{charge}}$ to the X-ray scattering structure factor $S_{X\text{-ray}}$ for [C₄C₅im][NTf₂]. There are clear differences between the two types of structure factors, with $S_{\text{charge}}$ primarily reflecting the ‘charge peak’ at 0.86 Å⁻¹ that is a signature of the characteristic charge network.

The charge network relaxation is characterised by the decorrelation of the dynamic charge–charge correlation structure factor $S_{\text{charge}(k,t)}$, Fig. 12. Note that $S_{\text{charge}(k,t)}$ is the central property reporting on the charge relaxation dynamics; ionic systems typically exhibit the slowest dynamical relaxation at length scales corresponding to the peak in $S_{\text{charge}}$.⁹⁴,⁹⁵ An exception are those systems which show a polarity peak with even slower relaxation, however this is not relevant for the ionic liquids in this work. The reason for the slow charge relaxation dynamics is that the long-range coulombic interactions impose restrictions on the movement of ions, for example electro-neutrality conditions, which must be fulfilled. In general, the charge network relaxation is faster at higher temperatures and for the ionic liquid with the more flexible anion, [C₄C₅im][NTf₂]; see ESI† for numerical values of the corresponding charge network relaxation times. At the higher temperature (333 K), $S_{\text{charge}(k,t)}$ at 1 ns is decorrelated for [C₄C₅im][NTf₂], but not for [C₄C₅im][CHTf₂]. This behaviour is expected, given that the different transport properties and dynamics are interrelated and show similar trends with increasing temperature.

The relative ratios by which charge network relaxation times increase from 333 K to 298 K are virtually identical for [C₄C₅im][NTf₂] (3.579) and [C₄C₅im][CHTf₂] (3.586). Comparing the charge network relaxation times across the two ionic liquids, it is evident that the relaxation is faster in [C₄C₅im][NTf₂] compared to [C₄C₅im][CHTf₂] by a factor of 1.59 at both temperatures. This is an interesting observation which shows the stability of the quantity $S_{\text{charge}(k,t)}$ introduced here. Furthermore, higher temperatures and higher conformational flexibility have a similar effect on structural relaxation, in line with the potential energy landscape picture.⁹⁶⁻⁹⁸ Thus, conformational flexibility as a design element is especially important for applications at low temperatures.

Information on intramolecular reorganisation – and thus conformational flexibility – can also be obtained from the fully atomistic MD simulations. To this end, we employ the intermittent dihedral autocorrelation function $C_{\text{dih}}(t)$, which describes how fast the anions transition from a given initial state ($C_{\text{dih}} = 1$) to a final, random state in which the conformations of the anions show no correlation to the initial state ($C_{\text{dih}} = 0$). The process of changing from $C_{\text{dih}} = 1$ to $C_{\text{dih}} = 0$ is called decorrelation. In addition, we will use the rotational correlation function $C_{\text{rot}}(t)$ of the sulphur–sulphur vector in the anion to describe orientational reorganisation of the molecular anion as a whole. The decorrelation is formally similar to that of $C_{\text{dih}}$, only that the monitored quantity is a vector rather than a conformation. Finally, we also calculated the $\alpha_2$ parameter, commonly called the non-Gaussian parameter. This parameter is used to identify deviations from a Gaussian diffusion profile, for example due to dynamical heterogeneity. These three functions are shown in Fig. 13, details on the theory behind them is given in the ESI†.

The $\alpha_2$ parameter at 333 K shows a maximum at 47 ps for [C₄C₅im][NTf₂] and at 77 ps for [C₄C₅im][CHTf₂]. The timescale of non-Gaussian behaviour shifts to longer times at lower temperature, at 298 K the maxima are located at 61 ps for [C₄C₅im][NTf₂] and 286 ps for [C₄C₅im][CHTf₂]. Rotational...
decorrelation also takes place on this intermediate timescale, which is between (fast) intramolecular dynamics and (slow) diffusive dynamics. It is this intermediate timescale which dominates the dynamics of structural relaxation and viscous flow.

By design, the [CHTf₂]⁻ anion is rigid, as opposed to the much more flexible [NTf₂]⁻ anion. This is reflected in the intermittent dihedral autocorrelation functions, which probe the cis-trans interconversion. Importantly, the conformational reorganisation (=decorrelation) in [C₄C₁Im][NTf₂] occurs on a shorter timescale than that of structural relaxation. Thus, the [NTf₂]⁻ anion can adjust its shape to the surroundings quickly enough to provide additional pathways for structural relaxation. These pathways are not available in the [C₄C₁Im][CHTf₂] ionic liquid, where cis-trans interconversion is too slow; hence rotation of the rigid [CHTf₂]⁻ anion as a whole is faster than this and thus the more likely response to changes in the environment.

It is often impossible for targeted modifications to be ‘perfect’, and some confounding variables are unavoidable. This is also the case for [C₄C₁Im][NTf₂] and [C₄C₁Im][CHTf₂]. For example, the equilibrium in the [CHTf₂]⁻ anion is shifted towards the trans conformer. This shift might impact the dynamics due to their different charge arm lengths, see ESI†. Briefly, the charge arm is the distance between the centre of mass and the centre of charge of an ion and is equivalent to the dipole moment. The charge arm length influences rotational-translational coupling between the ion and its environment and thus the dynamics in the ionic liquid. Hence, we also performed simulations of [C₄C₁Im][NTf₂] where the flexibility of the anion was removed artificially. To this end, harmonic biases were added to the two dihedral angles, every other aspect of the [C₄C₁Im][NTf₂] simulation was kept unchanged. Three separate simulations were run: (1) all anions were restricted to the cis conformer, (2) 317 anions in cis and 195 anions in trans, mimicking the native conformer ratio, and (3) all anions were...
restricted to the trans conformer. The resulting anion diffusion coefficients are shown in Fig. 14. Cation diffusion coefficients show the same trend, see ESI.

All four simulations with rigid anions showed significantly slower diffusion than the simulation of the native [C4C1im][NTf2] with flexible anion. As expected, a very small influence of the anion conformation – as opposed to the anion conformational flexibility – is visible. Specifically, rigid anions in cis conformation show a tendency to slightly faster diffusion than rigid anions in trans conformation, however the difference is within the error bars. This is in line with previous studies on the influence of charge asymmetry, see ESI.† However, the effect is very small compared to that of conformational flexibility.

Conclusions

In this work, we studied ionic liquids with targeted modifications of the widely used [NTf2]− anion. We used targeted modifications to isolate the effects of conformational flexibility, fluorination, and mass. We took care to address confounding variables, which required the use of several complementary methods. Importantly, only complementary experimental and computational techniques together gave a complete and consistent picture. For example, ab initio potential energy surfaces (PES) showed excellent agreement with experimental crystal structures. The ab initio PES provide insight into conformational flexibility of the anions, which in turn has a profound influence on macroscopic properties. Our results show that conformational flexibility of imide anions is a versatile design element to lower viscosities, lower thermal transition temperatures, and accelerate transport properties. Conformational flexibility of the anions furthermore leaves a clear signature in the DMTA spectra. The analysis of the DMTA spectra in combination with the ab initio PES revealed the possible rate-limiting steps underlying the structural relaxation.

Fluorination is another common design element for anions to improve the properties of the corresponding ionic liquids. Highly fluorinated anions have long been a preferred choice for ionic liquids with fast dynamics. However, fluorination has

![Fig. 13](image1.png)

Fig. 13 α2 parameter (blue), intermittent dihedral autocorrelation function C_dih(t) (solid red), and rotational correlation function C_rot(t) (dashed red) obtained from MD simulations of the ionic liquids (a) [C4C1im][NTf2] and (b) [C4C1im][CHTf2], both at 333 K.

![Fig. 14](image2.png)

Fig. 14 Anion self-diffusion coefficients obtained from MD simulations of native, flexible [C4C1im][NTf2], compared with targeted modifications where the anions in the simulation are restrained to cis/trans conformers. The ionic liquid [C4C1im][CHTf2] is shown for comparison.
several knock-on effects, for example by changing size and flexibility. In this work, we demonstrated how to separate these knock-on effects. Thus, we show that conformational flexibility plays an important role in the fluidity of $[\text{C}_4\text{C}_1\text{im}][\text{imid}]$ ionic liquids, while the impact of size is small.

The holistic picture developed in this work is crucial for the design of new ionic liquids. An excellent example are the two ionic liquids $[\text{C}_4\text{C}_1\text{im}][6\text{cPFSI}]$ and $[\text{C}_4\text{C}_1\text{im}][\text{NTfMs}]$. The first ionic liquid has a fully fluorinated, but conformationally locked anion, the anion of the second ionic liquid is only half-fluorinated but more flexible. Both ionic liquids have virtually identical viscosities to within a few percent. This demonstrates that a higher degree of fluorination is not always the optimal choice in terms of resulting properties of the ionic liquids, and that conformational flexibility of the anions should always be considered where transport properties are important.

MD simulations were used to compare the timescales of relaxation between ionic liquids with rigid and flexible anions. Conformational flexibility provides alternative pathways for relaxation on an intermediate timescale ($\approx 100$ ps). Structural relaxation, especially relaxation of the charge network, occurs on this timescale, which is critical for viscous flow. If the interconversion between conformers is slower than this intermediate timescale, then rotation of the rigid anion as a whole becomes the dominant pathway instead, so resulting in a more viscous liquid.

Finally, MD simulations allow for targeted modifications beyond what is accessible experimentally. The native conformer ratios are not the same in $[\text{NTf}_2]$ and $[\text{CHTf}_2]$, and the $[6\text{cPFSI}]^-$ anion is even fully locked in the cis conformer. Hence, several performed MD simulations of $[\text{C}_4\text{C}_1\text{im}][\text{NTf}_2]$ with the anions being restrained to well defined conformers. These simulations showed that the effect of the conformer ratio is small compared to conformational flexibility, thus validating the use of $[\text{CHTl}]^-$ and $[6\text{cPFSI}]^-$ as targeted modifications of the $[\text{NTf}_2]^{-}$ anion.

Data availability

Experimental and computational data is deposited in the ESI associated with this publication as well as on the Github pages given in the methodology.

Author contributions

Frederik Philippi: conceptualisation, data curation (simulation data, ESI†), formal analysis (statistical mechanics), investigation (syntheses, ab initio and MD simulations, force field development), methodology, project administration, software (prealpha), validation, visualisation, writing – original draft, writing – review and editing. Daniel Dauber: formal analysis (physicochemical data), investigation (syntheses, physicochemical characterisation), visualisation, writing – review and editing. Oriele Palumbo: formal analysis (DMTA), funding acquisition, investigation (DMTA measurements), methodology, writing – review and editing. Kateryna Golovizina: methodology, software (fftool), writing – review and editing. Jesse McDaniel: data curation, software (structure factors), writing – review and editing. David Pugh: data curation (XRD), formal analysis (XRD). Sophia Suarez: formal analysis (FFC), investigation (FFC), supervision. Carla C. Fraenza: formal analysis (FFC), investigation (FFC). Agilio Padua: software (fftool), supervision. Christopher W. M. Kay: resources (physicochemical characterisation equipment), supervision, writing – review and editing. Tom Welton: funding acquisition, resources (facilities for syntheses), supervision, writing – review and editing.

Conflicts of interest

There are no conflicts to declare.

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