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# 1. Introduction

The ever-increasing global energy demand tied with increasing environmental concerns<sup>1</sup> regarding climate change has progressively led towards the incorporation of renewable energy sources, such as wind and solar energy, within national grids. However, considering the intermittent nature of natural energy sources, energy storage is vital towards the realization of a

# Synergistic theoretical and experimental study on the ion dynamics of bis(trifluoromethanesulfonyl)imide-based alkali metal salts for solid polymer electrolytes<sup>†</sup>

Brigette Althea Fortuin, <sup>Dabc</sup> Jon Otegi, <sup>Db</sup> Juan Miguel López del Amo, <sup>Da</sup> Sergio Rodriguez Peña, <sup>Dab</sup> Leire Meabe, <sup>Da</sup> Hegoi Manzano, <sup>D\*b</sup> María Martínez-Ibañez <sup>D\*a</sup> and Javier Carrasco <sup>D\*ad</sup>

Model validation of a well-known class of solid polymer electrolyte (SPE) is utilized to predict the ionic structure and ion dynamics of alternative alkali metal ions, leading to advancements in Na-, K-, and Cs-based SPEs for solid-state alkali metal batteries. A comprehensive study based on molecular dynamics (MD) is conducted to simulate ion coordination and the ion transport properties of poly(ethylene oxide) (PEO) with lithium bis(trifluoromethanesulfonyl)imide (LITFSI) salt across various LITFSI concentrations. Through validation of the MD simulation results with experimental techniques, we gain a deeper understanding of the ionic structure and dynamics in the PEO/LITFSI system. This computational approach is then extended to predict ion coordination and transport properties of alternative alkali metal ions. The ionic structure in PEO/LITFSI is significantly influenced by the LITFSI concentration, resulting in different lithium-ion transport mechanisms for highly concentrated or diluted systems. Substituting lithium with sodium, potassium, and cesium reveals a weaker cation-PEO coordination for the larger cesium-ion. However, sodium-ion based SPEs exhibit the highest cation transport number, indicating the crucial interplay between salt dissociation and cation-PEO coordination for achieving optimal performance in alkali metal SPEs.

sustainable and efficient energy producing sector. The current market leader for energy storage systems, the lithium-ion battery (LIB), shows a high potential towards mitigating energy fluctuations from renewable energy sources within the grid.<sup>2</sup> Considering the rapid expansion of the energy storage market in addition to the rising cost and scarcity of lithium,<sup>3,4</sup> the need for developing alternative battery technologies to LIBs, is essential. Furthermore, demand for higher energy density, increased sustainability, abundant and economically viable energy storage systems have led to a surge in the exploration for alternative battery technologies beyond LIBs in recent years.<sup>5-7</sup> Post-lithium-ion batteries (post-LIBs), such as lithium-metal batteries (LMBs),<sup>8-11</sup> sodium-ion batteries (NIBs),<sup>4,12,13</sup> potassium-ion batteries (KIBs),14-17 and cesium-ion batteries (CIBs)18-20 are gaining momentum. Numerous advantages of these post-LIB technologies include higher redox potentials; Li<sup>+</sup>/Li (-3.04 V vs. SHE), Na<sup>+</sup>/Na (-2.71 V vs. SHE), K<sup>+</sup>/K (-2.93 V vs. SHE), and Cs<sup>+</sup>/Cs  $(-3.03 \text{ V } \nu s. \text{ SHE})$ , along with superior theoretical specific capacities,<sup>21</sup> an abundance of both sodium and potassium in the Earth's crust posing an attractively low cost alternative to lithium, and the higher diffusion coefficients (low diffusion barrier) of cesium-based electrodes resulting in hindered dendrite formation for cesium-ion batteries.<sup>20,22</sup> However, despite

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<sup>&</sup>lt;sup>a</sup> Centre for Cooperative Research on Alternative Energies (CIC energiGUNE), Basque Research and Technology Alliance (BRTA), Alava Technology Park, Albert Einstein 48, 01510 Vitoria-Gasteiz, Spain. E-mail: jcarrasco@cicenergigune.com, mmartinez@cicenergigune.com

<sup>&</sup>lt;sup>b</sup> Department of Physics, University of the Basque Country (UPV/EHU), 48940 Leioa, Spain. E-mail: hegoi.manzano@ehu.eus

<sup>&</sup>lt;sup>c</sup> ALISTORE-European Research Institute, CNRS FR 3104, Hub de l'Energie, Rue Baudelocque, 80039 Amiens Cedex, France

<sup>&</sup>lt;sup>d</sup> IKERBASQUE, Basque Foundation for Science, Plaza Euskadi 5, 48009 Bilbao, Spain

<sup>†</sup> Electronic supplementary information (ESI) available: Supporting tables and figures including force field parameters, chemical structures, lithium-ion speciation analysis, MD-based ionic conductivity convergence tests, MSD, DSC, EIS, Raman spectroscopy, MAS-NMR spectroscopy, and activation energies of the transport mechanisms for the different investigated systems. See DOI: https:// doi.org/10.1039/d3cp02989a

#### Paper

its promise, alkali metal batteries face high reactivity, with electrode and electrolyte components spontaneously reacting with most polar aprotic electrolyte solvents, resulting in unstable solid electrolyte interphases, which may affect cycle performance.<sup>21,23</sup> The limited stability and lifetime challenges are further reduced by failure mechanisms, such as dendritic growth on the anode and the current collector, internal shortcircuits and electrolyte decomposition, resulting in electrolyte loss.<sup>21,23,24</sup> Addressing these challenges, the successful development of alternative all-solid-state alkali metal battery technologies necessitates the advancement of alkali metal salts, considering their compatibility with various polymer matrices and alkali metalbased electrodes. Therefore, a fundamental understanding of ion coordination as well as ion transport mechanisms is crucial for assessing the overall performance of these SPEs.

Atomistic modelling of polymer electrolytes is an effective approach to accelerate the search towards new alkali metal salts and alkali metal-based electrolyte components, especially considering the recent advances in computing power.<sup>8,25–29</sup> The growing utilization of modelling techniques is driven by several factors, including reduced environmental impact compared to experimental processes, faster simulation times compared to traditional experimental methods, and the capability to acquire information that may not be readily attainable through experimental characterization techniques.<sup>8,30–34</sup> Yet, a key element for the successful integration of computational-based methods in materials development is comprehensive model validation against well-defined, high-quality experimental data, which is often lacking but crucially needed in the field.

Herein, we present a comprehensive study of the well-known PEO/LiTFSI SPE as a function of LiTFSI concentration. Our approach involves predicting ion coordination and ion transport using atomistic molecular dynamics (MD) simulations. A key aspect of our study is the validation of the model, where we have taken particular care to combine three different techniques: Raman, magic angle spinning nuclear magnetic resonance (MAS-NMR), and electrochemical impedance spectroscopies. This combination of well-defined experiments is crucial for validating our theoretical models and simulations. Notably, such a synergistic model validation study has been lacking in the literature on the PEO/LiTFSI SPEs, and our work fills this important gap. Furthermore, our validated theoretical approach provides valuable insight that extends beyond the PEO/LiTFSI system. Specifically, it allows us to predict similar properties for alternative alkali metal-based systems, such as PEO/XTFSI (X = Na, K, and Cs), broadening the scope of our study. These insights offer valuable guidance for designing new salts for SPEs, thus contributing to the advancement of the field.

# 2. Theoretical and experimental methods

#### 2.1. Theoretical methods and computational details

Classical MD simulations were conducted on  $PEO_n/LiTFSI$  for four different EO/Li<sup>+</sup> ratios (n = 6, 16, 20 and 32). To ensure the robustness of our results and eliminate any potential bias arising from the choice of MD software, we employed two of the most widely used codes in the literature: Gromacs<sup>35</sup> and LAMMPS.<sup>36</sup> Convergence tests were meticulously conducted to validate the consistency of results obtained from both codes. These tests, based on the total ionic conductivity as a function of temperature, enabled us to identify the optimal simulation time and box size for the studied systems (*cf.* Fig. S1–S3, ESI†). Based on these tests, a simulation time of 100 ns and a medium-sized box containing 40 ion pairs and 40 polymer chains were deemed sufficient to achieve accurate and comparable outcomes.

Considering that LAMMPS generally exhibits slower simulation performance compared to Gromacs,<sup>37,38</sup> we selected Gromacs to investigate the influence of salt concentration on Li-containing systems. This choice was particularly advantageous for highly diluted systems, where longer MD simulations are needed to obtain suitable statistical averages, making Gromacs the preferred option due to its higher speed. In contrast, LAMMPS was exclusively utilized to study one intermediate concentration (n = 20) while also exploring the role of different alkali metals (Li<sup>+</sup>, Na<sup>+</sup>, K<sup>+</sup>, and Cs<sup>+</sup>). By adopting this approach, we aimed to ensure the validity and reliability of our findings while investigating the diverse aspects of our research.

Specifically, we considered the following computational setups. For the simulations performed using Gromacs,<sup>35</sup> the simulation boxes consisted of 40 PEO chains with 24 EO repeating units in each chain ( $M_w = \sim 1056 \text{ g mol}^{-1}$ ), and 160, 60, 48 and 30 LiTFSI ion pairs, for n = 6, 16, 20, and 32, respectively. Initial boxes were generated randomly as implemented in Gromacs. With LAMMPS<sup>36</sup> we examined the ion coordination and transport properties for PEO<sub>20</sub>/XTFSI systems, where X = Li, Na, K, or Cs. In this case, the simulation boxes consisted of 40 PEO chains with 20 EO repeating units in each chain ( $M_w = \sim 880 \text{ g mol}^{-1}$ ), and 40 XTFSI ion pairs with initial configurations containing randomly positioned molecules, generated using Packmol.<sup>39</sup>

Prior to the MD production simulations, an efficient and multistep protocol was applied to prepare and equilibrate the systems. It is worth noting that due to the implementation of Gromacs programming, the initial simulation box needs to be relatively large, resulting in low densities, e.g.,  $1.649 \times 10^{-1}$  g cm<sup>-3</sup> for PEO<sub>32</sub>/LiTFSI. To ensure the appropriate geometry of the system, the first step in this case involves an energy minimization process where the positions of the molecules are adjusted to achieve a state of minimum energy. Accordingly, an initial NPT structural compression step was carried out using the Berendsen thermostat and the Parrinello-Rahman barostat (with a relaxation time of 5 ps for all cases). This compression was performed at -267 °C (10 K) under a pressure of 98.99 atm (100 bar) to obtain densities closer to experimental values, i.e., simulated (experimental): 1.352 (1.234) g cm<sup>-3</sup> (PEO<sub>6</sub>/LiTFSI), 1.193 (1.188) g cm<sup>-3</sup> (PEO<sub>16</sub>/LiTFSI), 1.159 (1.179) g cm<sup>-3</sup> (PEO<sub>20</sub>/LiTFSI), and 1.167 (1.164) g cm<sup>-3</sup> (PEO<sub>32</sub>/LiTFSI). Subsequently, a gradual heating process to 327 °C (600 K) at 1 atm and equilibration in an NVT ensemble were conducted to prevent the formation of possible metastable configurations.

The temperature increase followed an exponential pattern based on the time constant (1 ps). Afterwards, the systems underwent a cooling *NPT* procedure to reach the simulation temperature of 70 °C (343 K) and pressure of 1 atm. The final configuration was further equilibrated for 1 ns under similar conditions. Finally, the production MD simulations were performed in the *NVT* ensemble for 200 ns (PEO<sub>*n*</sub>/LiTFSI) or 100 ns (PEO<sub>20</sub>/XTFSI) to ensure a fully diffusive regime.

All-atom optimized potentials for liquid simulations (OPLS-AA) force field<sup>34,40–44</sup> were utilized to describe the energy potentials of PEO, Li<sup>+</sup>, Na<sup>+</sup>, K<sup>+</sup>, Cs<sup>+</sup>, and TFSI<sup>-</sup>, including the force field parameters (bond stretching, bond-angle, dihedral angle, and Lennard-Jones potential). The force field parameters used in this study are available in the ESI† (Tables S1, S2 and Fig. S4). The trajectories obtained by the MD simulations were analyzed using Travis analyzer.<sup>45,46</sup>

We utilized the default atomic charges from the OPLS-AA force field for the PEO atoms. However, to enhance the accuracy and suitable description of our systems, we conducted an optimization of the TFSI<sup>-</sup> anion's structure in the gas-phase and computed its corresponding atomic charges using density functional theory (DFT) calculations. Subsequently, we incorporated these recomputed charges to update the original OPLS-AA force field. The DFT calculations were performed with the Fritz Haber Institute ab initio molecular simulations (FHI-AIMS) software,<sup>47,48</sup> incorporating the Becke's three parameters (B3) exchange functional with the Lee-Yang-Parr (LYP) nonlocal correlation functional (B3LYP)<sup>49,50</sup> adopted with the "tier2" standard basis set in the FHI-AIMS code. The partial charges of TFSI<sup>-</sup> were calculated using the electrostatic potential (ESP) method  $^{26,27,30,34,51-54}$  and scaled to -0.7. The charges of Li<sup>+</sup>,  $Na^+$ ,  $K^+$ , and  $Cs^+$  were also scaled to +0.7 each to maintain charge neutrality. This scaling factor is used to account for the effects of polarization, which are not considered in conventional classical MD simulations since the charges are treated as unchangeable point charges. The value of 0.7 is often used in the literature for simulating similar PEO-based polymer electrolytes.<sup>26,27,52-54</sup> The cut-off for van der Waals forces and the real space of Ewald summation was selected to be 10 Å, with the fast smooth particle mesh Ewald (PME) electrostatics<sup>55,56</sup> to treat Coulomb interactions in periodic systems.

Considering the computed MD trajectories, the diffusion coefficient of each species was deduced from its mean square displacement (MSD), using the Einstein relation:<sup>57</sup>

$$D = \lim_{(t \to \infty)} \frac{1}{6t} \langle |r_i(t) - r_i(0)|^2 \rangle$$
(1)

where *D* is the diffusion coefficient, *t* is the time elapsed,  $r_i(t)$  is the displacement travelled of species *i* at time *t*, and  $r_i(0)$  refers to the displacement of species *i* at the origin. Based on eqn (1), once the diffusion coefficients were procured, the Nernst-Einstein relation<sup>57</sup> in eqn (2) was used to deduce the ionic conductivity of each ionic species:

$$\sigma_i = \frac{q_i^2 c_i}{k_{\rm B} T} D_i \tag{2}$$

where  $\sigma_i$  is defined as the ionic conductivity,  $q_i$  refers to the unscaled charge of  $\pm 1$  for the studied cation and TFSI<sup>-</sup> ion, respectively,  $c_i$  the concentration,  $D_i$  the diffusion coefficient of species *i*, *T* represents the temperature of the system, and  $k_{\rm B}$  represents the Boltzmann constant.

The cation transport numbers based on MD simulations were calculated using eqn (3):

$$t_{\rm X^+}^{\rm MD} = \frac{\sigma_{\rm X^+}}{\sigma_{\rm total}} \tag{3}$$

where  $t_{X^+}^{MD}$  represents the cation transport number,  $\sigma_{X^+}$  the ionic conductivity, and  $\sigma_{total}$  the total ionic conductivity, determined from the sum of the cation and anion conductivities, for the respective cation species (X<sup>+</sup> = Li<sup>+</sup>, Na<sup>+</sup>, K<sup>+</sup>, or Cs<sup>+</sup>) with the TFSI<sup>-</sup> anion.

#### 2.2. Materials

PEO ( $M_w = 5 \times 10^6 \text{ g mol}^{-1}$ ), LiTFSI (99.9%), and acetonitrile (ACN) were purchased from Sigma Aldrich. Prior to use, LiTFSI was dried overnight at 100 °C under vacuum. An argon-filled glovebox was utilized to conduct all the procedures related to the moisture or oxygen sensitive materials (MBraun, H<sub>2</sub>O and O<sub>2</sub> < 0.5 ppm).

#### 2.3. Preparation of polymer electrolyte membranes

We used the solvent-casting preparation method to fabricate five different PEO<sub>n</sub>/LiTFSI formulations, with ethylene oxide (EO)/Li<sup>+</sup> ratios of 6, 16, 20, 32, and 64. The PEO-systems were dissolved in ACN and subjected to a two-step drying process to remove any residual solvent: (i) the solution was left to dry under ventilation at 35 °C for 24 h, and (ii) it was further dried under dynamic vacuum at 50 °C for an additional 24 h. Subsequently, PEO-based SPEs were prepared using the hot pressing method at 60 °C and 3 tons, with varying processing times. For the measurement of ionic conductivity, SPEs with a target thickness of 300  $\mu$ m and a diameter of 4 mm were used. Meanwhile, lithium symmetric cells were constructed with SPEs having a thickness of 100  $\mu$ m and a diameter of 16 mm.

#### 2.4. Differential scanning calorimetry (DSC)

A DSC Discovery 2500 (TA Instrument) instrument was used to study the phase transition behaviour of the SPEs from -80 to 100 °C, with heating and cooling rates of 10 K min<sup>-1</sup>. Following this, the SPE samples (*ca.* 10 mg) were sealed in Al crucibles in an argon-filled glovebox. Thermal properties, including the values for the glass transition temperature ( $T_{\rm g}$ , midpoint of the heat capacity change), melting temperature ( $T_{\rm m}$ , maximum of the endothermic peak), and melting enthalpy ( $\Delta H_{\rm m}$ , area below the endothermic peak), were deduced from the second heating scan. The calculation of the crystalline fraction ( $\chi_{\rm C}$ ) of the polymer electrolytes was performed using eqn (4):

$$\chi_{\rm C} = \frac{\Delta H_{\rm m}}{\Delta H_{\rm m_{PEO}} \times f_{\rm SPE}} \times 100\%$$
(4)

where  $\Delta H_{\rm m}$  the melting enthalpy of the electrolyte,  $\Delta H_{\rm mPEO}$  the melting enthalpy for 100% crystalline polymer matrix (205 J  $g^{-1}$ for PEO<sup>58</sup>), and  $f_{\text{SPE}}$  the polymer weight fraction of the SPE.

#### 2.5. Ionic conductivity and lithium transference number

CR2032 type coin cells were assembled in an argon-filled glovebox to measure both the ionic conductivity and the lithium-ion transference number for the respective studied systems. The ionic conductivity was measured by using two stainless steel (SS) blocking electrodes, with the configuration SS|SPE|SS and a SPE area of 0.1257 cm<sup>2</sup>, based on electrochemical impedance spectroscopy (EIS), performed on a Multichannel VMP3 (Biologic, Claix France) with a signal amplitude of 10 mV over the frequency range  $10^{-1}$ – $10^{6}$  Hz, at 40 and 70 °C. A stabilization period of 8 h was employed for the measurement at 40 °C, and 2 h for the measurement at 70 °C. The following equation was employed to calculate the ionic conductivity, eqn (5):

$$\sigma_{\rm DC} = \frac{t}{R_{\rm bulk} \times A} \tag{5}$$

where  $\sigma_{\rm DC}$  corresponds to the direct current ionic conductivity, t the thickness of the electrolyte (ca. of 0.3 mm), A represents the area of the electrolyte of 0.1257 cm<sup>2</sup>, and  $R_{\text{bulk}}$  represents the bulk resistance of the polymer electrolyte measured by EIS.

Lithium-ion symmetric cells were assembled using a Li|SPE|Li configuration. The lithium-ion transference number was measured following the procedures as described by Bruce and Vincent et al.,59 measured at 40 and 70 °C. CR2032 type coin cells were employed, sandwiching the SPEs between two lithium discs, with a lithium-metal area of 1.54 cm<sup>2</sup>. Prior to EIS measurements, the cells were left to stabilize at 40 °C for 8 h, and at 70 °C for 6 h. Eqn (6) was employed to calculate the lithium-ion transference number,  $T_{\text{Lit}}^{\text{EIS}}$ :

$$T_{\mathrm{Li}^{+}}^{\mathrm{EIS}} = \frac{I_{\mathrm{ss}}(\Delta V - I_{\mathrm{i}}R_{\mathrm{i},\mathrm{Li}^{+}})}{I_{\mathrm{i}}(\Delta V - I_{\mathrm{ss}}R_{\mathrm{ss},\mathrm{Li}^{+}})}$$
(6)

where  $I_i$  and  $I_{ss}$  represent the initial and steady-state current, respectively;  $R_{i,Li^+}$  and  $R_{ss,Li^+}$  represent the initial and steadystate lithium interfacial resistance, respectively; and  $\Delta V$  represents the total polarization voltage (10 mV).

#### 2.6. Raman spectroscopy

Raman spectra were collected using a Renishaw inVia confocal Raman spectrometer (serial number 16H981) with an incident laser with a wavelength of 532 nm (laser spot size: 0.8 m; spatial resolution: 0.4 m). The Raman spectra, collected in the range of 3000–300 cm<sup>-1</sup>, were recorded at 25, 40, and 70 °C with increasing temperature, and a stabilization time of 2 h (40 °C) and 1 h (70 °C). To increase the signal-to-noise ratio (S/N), each plotted spectrum is the average of 10 accumulations of approximately 3 minutes each. The spectra shown has been normalized from 0 to 1. The samples were placed in a sealed, air-tight cell built with a Raman-inactive glass window and assembled in an argon-filled glovebox to prevent contamination from ambient atmosphere (e.g., air, water).

#### 2.7. MAS-NMR spectroscopy

<sup>7</sup>Li MAS-NMR spectroscopy was employed to determine the chemical environments of lithium-ion upon concentration changes within the PEO matrix. The experiments were recorded using a WB 500 MHz Bruker Advance III spectrometer equipped with a 2.5 mm probe and was conducted on LiTFSI powder, concentrated PEO<sub>6</sub>/LiTFSI and diluted PEO<sub>32</sub>/LiTFSI SPEs. All samples were spun at a magic angle with a MAS frequency of 20 kHz. The <sup>7</sup>Li MAS-NMR spectra were recorded by using a single pulse experiment (3 µs pulse), with its chemical shift referenced to a 0.1 M solution of LiCl. The temperaturevariation NMR spectra were recorded by varying the temperature, from 40 to 80 °C, with a stabilization time of approximately 1 h in between measurements. DMFIT software was used to analyze the spectra.<sup>60</sup>

### Results and discussion

Ion coordination, lithium-ion speciation, and ion transport properties were assessed through MD simulations, focusing on particle density changes around lithium cation or TFSIanions within the PEO polymer matrix. The MD simulations were conducted at 70 °C, as classical MD simulations are limited to studying molecular kinetics and cannot properly simulate the thermodynamic properties of semicrystalline regions that might be present at lower temperatures. Moreover, the modelling of the PEO<sub>64</sub>/LiTFSI system was excluded since longer time and length scales are required to suitably account for the diffusivity of ionic species within PEO at such low concentrations. 53,54,61,62

The computational framework was validated at 70 °C using experimental techniques, including DSC to analyze polymer chain dynamics, Raman, and NMR spectroscopies for probing the ion coordination environments, and EIS for examining ion transport properties.

The validation of the computational framework enabled the prediction of various properties of alternative alkali metal-ions. MD simulations were performed on PEO<sub>20</sub>/XTFSI, investigating the effects of substituting lithium with sodium, potassium, or cesium cations on ionic transport mechanisms. The analysis included ion coordination, ion conductivity, and ion transport, which are critical factors influencing the performance of SPEs in all-solid-state batteries.

#### 3.1. Model validation of PEO<sub>n</sub>/LiTFSI SPEs

3.1.1. Modelling lithium-ion solvation and mobility. The local ion coordination environment of PEO<sub>n</sub>/LiTFSI systems was analyzed by calculating the radial distribution function (RDF) and the corresponding coordination numbers (CNs) at different LiTFSI salt concentration, offering insights into the extent of salt dissociation. RDFs describe the probability of finding a particle at a specific distance from a reference particle, indicating the degree of association between two species of interest. The CN is then obtained by integrating the probability curve, representing the number of reference

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particles found within the coordination sphere range of the species of interest.

Fig. 1(a) and (b) displays both the RDFs and CNs of interaction of the reference particle, lithium, with either PEO, denoted as Li<sup>+</sup>-O<sup>-</sup>(PEO), or TFSI<sup>-</sup> ions, denoted as Li<sup>+</sup>-O<sup>-</sup>(TFSI<sup>-</sup>), via their respective oxygen atoms. Comparing the RDFs of the lithium-polymer (Li<sup>+</sup>-O<sup>-</sup>(PEO)), and lithium-TFSI<sup>-</sup> (Li<sup>+</sup>-O<sup>-</sup>(TFSI<sup>-</sup>) interactions, Li<sup>+</sup>-O<sup>-</sup>(PEO) possesses a significantly higher RDF peak intensity and an average CN of 5 compared to the latter Li<sup>+</sup>-O<sup>-</sup>(TFSI<sup>-</sup>). At first glance, based on the CNs, nearly complete LiTFSI dissociation is observed for most of the investigated systems, attributed to the preferential solvation of the oxygen dense EO units from PEO.<sup>28,30,34,54,63</sup>

The incomplete LiTFSI dissociation observed at highly concentrated PEO<sub>6</sub>/LiTFSI strongly suggests the formation of ion pairs. This phenomenon can be attributed to two primary factors. Firstly, the increased probability of electrostatic interactions leads to a higher likelihood of ion cluster formation. Secondly, the reduced number of EO coordination sites

2.5

Distance (Å)

available for lithium-ion solvation plays a significant role. This scenario becomes evident at such high salt concentration, where the EO/Li<sup>+</sup> ratio is around 6, causing the coordination between ether oxygen atoms and Li ions to approach saturation. Consequently, it is natural for some Li ions to coordinate with TFSI<sup>-</sup> oxygen atoms instead.

Advancing the prediction to a more in-depth analysis regarding the lithium-ion coordination environment, lithium-ion molecular speciation analysis is performed as a function of LiTFSI salt concentration. Based on RDF analysis, the local minimum of the first RDF peak, for both  $Li^+-O^-(PEO)$ and Li<sup>+</sup>-O<sup>-</sup>(TFSI<sup>-</sup>) coordination types, is observed at 3 Å (cf. Fig. 1(a) and (b)).

This local minimum corresponds to the edge of the first solvation shell for Li<sup>+</sup>-ions, therefore, it is selected as the cut-off distance for the lithium-ion molecular speciation analysis. The effects of LiTFSI salt concentration upon the types of ionic species, such as polymer-Li<sup>+</sup>, polymer-polymer, and various ion-ion interaction interdependencies are plotted in Fig. 1(c) as

PEO<sub>6</sub>/LiTFSI

PEO16/LITFS

PEO<sub>20</sub>/LiTFS

PEO<sub>32</sub>/LiTFS

3.5

3.0



(b)

Radial Distribution Function /

Coordination number

PEO<sub>6</sub>/LiTFSI

PEO<sub>16</sub>/LiTFS

PEO<sub>20</sub>/LiTFS

PEO<sub>32</sub>/LiTFS

3.5

3.0

30

25

20

15

10

5

0

1.5

Li<sup>+</sup>-O<sup>-</sup> (TFSI<sup>-</sup>)

2.0

2.0

2.5 stance (Å) 3.0

2.5

Distance (Å)

(c) Lithium-ion molecular speciation analysis with lithium-ion as the reference species. The different types of lithium-ion speciation are represented by different colours: isolated Li<sup>+</sup> (blue), Li<sup>+</sup>–O<sup>-</sup>(PEO) (green), Li<sup>+</sup>–O<sup>-</sup>(<sup>TFSI<sup>-</sup></sup>) (purple), and Li<sup>+</sup>–O<sup>-</sup>(TFSI<sup>-</sup>) (red). RDFs and lithium-ion molecular speciation analyses were calculated from MD simulations conducted at 70 °C.

(a)

Radial Distribution Function /

(c)

Coordination number

30

25

20

15

10

5

1.5

Li<sup>+</sup>-O<sup>-</sup> (PEO)

2.0

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percentage probability. The lithium-ion molecular speciation remains consistent regardless of the EO/Li<sup>+</sup> ratio, in good agreement with RDF analyses and previous literature findings.<sup>26,52–54</sup> Predominantly, lithium ions interact with PEO via its oxygen atoms, denoted in the following as  $Li^+-O^-(PEO)$ . The occurrence of  $Li^+ - O^-$  (PEO) speciation increases as the LiTFSI salt concentration decreases, observed in both PEO<sub>20</sub>/LiTFSI and PEO<sub>32</sub>/LiTFSI (99%), and similarly in PEO<sub>16</sub>/LiTFSI (98%). However, there is a significant decrease in this speciation for highly concentrated PEO<sub>6</sub>/LiTFSI (77%) (cf. Table S3, ESI<sup>+</sup>). Additionally, a second type of lithium-ion molecular speciation, where lithium ions interact with the oxygen atoms from both TFSI<sup>-</sup> anions and PEO chains, is exclusively present in PEO<sub>6</sub>/ LiTFSI (23%), denoted as  $Li^+ - O^- {TFSI^- \choose PEO}$ . The relatively higher LiTFSI salt concentration and lower PEO concentration in PEO<sub>6</sub>/LiTFSI limit the available PEO oxygen solvation sites, which hinders LiTFSI dissociation and may promote ion cluster formation,<sup>26,52</sup> since lithium ions are preferentially solvated by the oxygen atoms from PEO,<sup>64–67</sup> there is a higher probability of  $Li^+ - O^-({}_{PEO}^{TFSI^-})$  speciation in this case.

The study of ion transport incorporates MSD analysis, a useful tool for examining the displacement of particles over time. MSD analysis allows computation of diffusion coefficients (eqn (1)) and lithium-ion transport numbers (eqn (3)). As shown in Fig. 2(a), it is evident that TFSI<sup>-</sup> anions exhibit greater displacement than lithium ions regardless of the EO/Li<sup>+</sup> ratio of the SPEs.

Upon closer inspection, it is evident that higher ion mobilities are observed for  $PEO_{20}/LiTFSI$ , closely followed by  $PEO_{16}/LiTFSI$ . In contrast, for  $PEO_6/LiTFSI$ , the effects of ion pair formation become evident through notably lower Li<sup>+</sup> and  $TFSI^$ ion mobilities in this highly concentrated system, as revealed by RDF analyses. When comparing the MSD of lithium ions to the oxygen atoms from PEO, as depicted in Fig. S5 (ESI<sup>+</sup>), it becomes apparent that lithium-ion mobility is primarily limited by polymer chain movement, as the MSD peaks for the respective atoms consistently correlate. In moderately and highly diluted  $PEO_n/LiTFSI$  systems, the MSD curves for lithium-ion mobility are lower compared to the displacement of oxygen atoms from PEO. Remarkably, for the highly concentrated  $PEO_6/LiTFSI$ , the lithium-ion transport appears to be nearly equivalent to PEO motion, suggesting the presence of a distinct lithium-ion transport mechanism in this case.

Self-diffusion coefficients as a function of LiTFSI concentration, plotted in Fig. 2(b), tend to be higher for TFSI<sup>-</sup> compared to Li<sup>+</sup> ions, irrespective of the LiTFSI concentration. Discernably, more dilute EO/Li<sup>+</sup> ratios of 20:1 and 32:1 display higher Li<sup>+</sup> and TFSI<sup>-</sup> ion self-diffusion coefficients, substantiated by RDF analyses which indicate nearly complete LiTFSI dissociation for these ratios. Fig. 2(b) additionally displays the lithium-ion transport number  $t_{Li^+}^{MD}$ . The  $t_{Li^+}^{MD}$  trend remains relatively consistent, except for PEO<sub>6</sub>/LiTFSI, which shows the lowest value of 0.21. For the other studied PEO<sub>n</sub>/LiTFSI systems,  $t_{Li^+}^{MD}$  only slightly increases, with PEO<sub>16</sub>/LiTFSI (0.31), PEO<sub>20</sub>/LiTFSI (0.31), and PEO<sub>32</sub>/LiTFSI (0.30) displaying comparable values (*cf.* Table S4, ESI<sup>+</sup>). Interestingly, the modelled ion pair effects predicted for PEO<sub>6</sub>/LiTFSI do not seem to significantly alter the ion transport effects.

The lithium-ion transport mechanism can be deduced from the analysis shown in Fig. S6(a) and (b) (ESI<sup>+</sup>), where a reference lithium-ion is selected to demonstrate lithium-ion diffusion concerning the oxygen atoms from PEO, referred to as the O index, or the oxygen atoms from the TFSI<sup>-</sup> anions, denoted as the TFSI index. The MD trajectory involved 24 EO monomers to represent 40 PEO chains in the system, which included either 160 (PEO6/LiTFSI) or 30 (PEO32/LiTFSI) additional Li-TFSI ion pairs. Each single PEO chain is visualized separated by delineated dash lines in Fig. S6 (ESI<sup>†</sup>), and similarly, each TFSI<sup>-</sup> ion is separated accordingly. It is important to emphasize that while we focus on a single Li<sup>+</sup> ion in the analysis displayed in Fig. S6 (ESI<sup>†</sup>) to illustrate the diffusion mechanism, the same mechanism applies when considering other Li<sup>+</sup> ions as reference. Essentially, the lithium-ion transport mechanism at high concentrations is inferred from the



**Fig. 2** (a) MSD functions for lithium- (solid line) and TFSI<sup>-</sup> ions (dashed line) as a function of LiTFSI salt concentration. (b) Self-diffusion coefficients for the studied EO/Li<sup>+</sup> ratios, for Li<sup>+</sup> (solid column) and TFSI<sup>-</sup> (striped column) as well as lithium-ion transport numbers,  $\binom{MD}{Li^+}$  (solid line). MSDs, self-diffusion coefficients, and lithium-ion transport numbers were calculated from MD simulations conducted at 70 °C.

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collective data presented in Fig. 1(c) and Table S3 (ESI<sup>†</sup>), and the data used in Fig. S6 (ESI<sup>†</sup>) serves as a representative example. It is observed that the lithium-ion dissociates from TFSI<sup>–</sup> ions at the beginning of the simulation, moves towards a PEO chain, and interacts with oxygen atoms from both the TFSI<sup>–</sup> ions and PEO. Eventually, the lithium-ion diffuses along a single polymer chain while remaining coordinated with TFSI<sup>–</sup> ions for the remainder of the simulation time. This verifies that lithium-ion diffusion for concentrated PEO<sub>6</sub>/LiTFSI occurs *via* diffusion along a single polymer chain. In the case of PEO<sub>32</sub>/ LiTFSI, the lithium-ion barely interacts with TFSI<sup>–</sup> ions, clearly jumping from one PEO chain to another, confirming that the lithium-ion transport mechanism for moderately dilute PEO<sub>n</sub>/LiTFSI systems occurs *via* an ion-hopping mechanism.

3.1.2. Experimental validation of lithium-ion coordination and dynamics. Polymer chain flexibility plays a crucial role in understanding ion dynamics, which can be explored by studying the crystalline-amorphous phase transition using DSC. The DSC traces for the studied SPEs (Fig. S7, ESI†) exhibit an increase in the glass transition temperature,  $T_g$ , as the LiTFSI content rises (*cf.* Table S5, ESI†). This can be linked to the higher LiTFSI concentration, which increases the number of lithium ions coordinated to PEO, impacting the heat capacity near  $T_g$ . Additionally, the increased LiTFSI concentration also raises the number of charge carriers, which slows down the segmental motion of the polymer chains.<sup>68,69</sup> Consequently, PEO<sub>6</sub>/LiTFSI possesses the highest  $T_g$  of -26 °C, indicating slower polymer segmental motion and slower ion dynamics, as predicted by the MD simulations.

In the case of highly diluted PEO<sub>64</sub>/LiTFSI, the absence of a  $T_{\rm g}$  can be ascribed to several factors: the exceptionally low LiTFSI content and significantly high PEO content result in a highly crystalline SPE (56%); additionally, the  $T_{\rm g}$  dependency on the temperature sweep rate<sup>70</sup> may also contribute to the absence of a  $T_{\rm g}$  signal.

The studied SPEs with EO/Li<sup>+</sup> ratios of 16 and 20 display comparable  $T_{\rm g}$  values of -35 °C, however, the slightly more diluted PEO<sub>32</sub>/LiTFSI exhibits the lowest  $T_{\rm g}$  (-43 °C), indicating improved polymer chain flexibility. Lower temperatures are required to expedite polymer motion in this case, leading to enhanced polymer mobility and, consequently, faster ion dynamics and Li<sup>+</sup>-ion mobility, as supported by the MSD analysis from the MD simulations.

The melting transition temperature,  $T_{\rm m}$ , supplies information regarding the temperature range at which the SPE is molten and its long-range structure transitions to a disordered amorphous system (*cf.* Fig. S7 and Table S5, ESI<sup>†</sup>). Contrary to the trend for the  $T_{\rm g}$ , the  $T_{\rm m}$  increases slightly as LiTFSI content decreases, from  $T_{\rm m}$  = 49 to 62 °C, for PEO<sub>16</sub>/LiTFSI and PEO<sub>64</sub>/ LiTFSI, respectively, which indicates that the lithium salt promotes the amorphization of the crystalline domains resulting in lower melting temperatures. Additionally, the enthalpy of the melting transition,  $\Delta H_{\rm m}$ , has been used to estimate the crystallinity degree,  $\chi_c$ , of the studied PEO-based SPEs, which represents the fraction of the polymer that is in a relatively ordered state. Based on the data presented in Table S5 (ESI<sup>†</sup>), a clear trend emerges, showing an increase in  $\chi_c$  with decreasing LiTFSI concentration. This observation can be attributed to the increase in the proportion of semi-crystalline PEO and the corresponding decrease in the amount of LiTFSI salt. This trend confirms the amorphization effect of polar LiTFSI within the PEO matrix.

Proceeding with the validation of the model, Raman and MAS-NMR spectroscopies were utilized to evaluate the accuracy of the computational predictions concerning the impact of salt concentration on the lithium-ion coordination environment. Raman spectra were obtained for various EO/Li<sup>+</sup> ratios at temperatures of 25 °C (cf. Fig. S8(a), ESI†), 40 °C (cf. Fig. S8(b), ESI<sup>+</sup>), and 70 °C (Fig. 3(a)). Peak deconvolution was then performed to quantify the extent of LiTFSI association as a function of LiTFSI concentration and temperature, with results shown for PEO<sub>6</sub>/LiTFSI in Fig. 3(b) (cf. Table S6, ESI<sup>+</sup>). For further insight, we conducted MAS-NMR measurements on two distinct SPE systems: a highly concentrated PEO<sub>6</sub>/LiTFSI and a highly diluted PEO<sub>32</sub>/LiTFSI (see Fig. 4 and Table S7, ESI†). These measurements allowed us to discern notable dissimilarities in ion dynamics as a function of concentration and temperature.

Analysis of the Raman spectra reveals distinct vibrational peaks for the *S*–*N*–*S* vibration at 70 °C. Coordinated LiTFSI ion pairs form, as evidenced by the signal at 747 cm<sup>-1</sup>, while free ion pairs appear at 740 cm<sup>-1</sup>, consistent with previous studies.<sup>30,34,71–74</sup> Upon a decrease in LiTFSI salt concentration, from highly concentrated PEO<sub>6</sub>/LiTFSI to highly diluted PEO<sub>64</sub>/LiTFSI, a clear downshift is observed from 743 to 741 cm<sup>-1</sup>, corresponding to coordination that changes from partially coordinated Li<sup>+</sup>–TFSI<sup>-</sup> to the free TFSI<sup>-</sup> form. These experimental results align with the predictions from the MD simulations, confirming the accuracy of the computational model. Essentially, the increased dissociation of LiTFSI at lower LiTFSI salt concentrations is evident from the Raman trends, further validating the simulated coordination environment.

The quantification of the effect of both LiTFSI concentration and temperature changes upon the lithium-ion coordination environment was attained by performing peak deconvolution of the studied PEO<sub>n</sub>/LiTFSI SPEs at various temperatures of 25 °C, 40 °C and 70 °C (cf. Table S6 and Fig. S8, ESI†). The temperature effect proves to produce significant changes in the quantification of the two different coordination environments principally detected for LiTFSI.<sup>71,72</sup> It is important to highlight that the Raman spectra collected at 25 °C in this study was performed prior to a preheating treatment step,<sup>71</sup> for which non-preheated and preheated SPEs' spectra may show considerable differences in the S-N-S vibration window for more concentrated PEO<sub>6</sub>/LiTFSI, assigned to the small amount of ion pairs present in the amorphous phase.<sup>71</sup> Examining the effect of concentration changes, mainly PEO6/LiTFSI and PEO16/LiTFSI display notable differences, with the remaining SPEs showing comparable results, i.e., complete LiTFSI dissociation. A moderate contribution from coordinated LiTFSI is seen for PEO<sub>6</sub>/LiTFSI at 40 °C (15%), significantly increased at 70 °C (23%). Clearly, the local ionic structure of highly concentrated PEO<sub>6</sub>/LiTFSI is



Fig. 3 Raman spectra for the 730 (720)-760 cm<sup>-1</sup> vibrational window illustrating the (a) S-N-S vibration for PEO<sub>n</sub>/LiTFSI SPEs at 70 °C, with spectra of neat LiTFSI and neat PEO at 25 °C. The grey arrow represents the downshift observed upon decreased LiTFSI concentration. Raman

spectra of (b) PEO<sub>6</sub>/LiTFSI at 40 (bottom) and 70 °C (top). The solid black line represents recorded spectra, the solid green line with symbols corresponds to the cumulative fit of Voigt character performed by peak deconvolution analysis, with the contribution from the coordinated character (orange) and the free TFSI- ion character (purple). The two vertical dotted lines correspond to the coordinated contact ion pair position at 747 cm<sup>-1</sup> (orange) and the free ion pair position at 740 cm<sup>-1</sup> (purple), respectively

affected by the melting transition of the SPE.<sup>71,72</sup> Conversely, in the case of PEO<sub>16</sub>/LiTFSI, a negligible decrease in the coordinated LiTFSI form is observed, transitioning from 7% at 40  $^\circ C$ to 4% at 70 °C. These results suggest that more dilute  $PEO_n/$ LiTFSI systems (n > 6) tend to retain their ionic structure despite changes in temperature.

MAS-NMR spectroscopy is a well-established technique to probe both ion and polymer dynamics at short-range order length scales (1-2 Å) for a given nucleus. This technique offers detailed information about chemical environments and their temporal fluctuations. Thus, we used <sup>7</sup>Li solid-state NMR to gain a deeper understanding of the changes in the local lithium-ion structure and dynamics<sup>75,76</sup> as a function of lithium salt concentration at various temperatures. The line broadening observed in the <sup>7</sup>Li MAS-NMR resonances can be correlated to the rates and amplitudes of local fluctuations in the Li<sup>+</sup> environments, arising from dynamic averaging of local

dipolar and quadrupolar interactions. Slower polymer and lithium-ion dynamics result in broader NMR signals, whilst faster dynamics lead to narrower signals.75,77 In Fig. 4, the variable temperature <sup>7</sup>Li MAS-NMR spectra of PEO<sub>32</sub>/LiTFSI exhibit a transition from a two- to a one-component system, with both signals becoming narrower as the temperature increases. The broader component eventually disappears in the temperature range of 60-70 °C. In contrast, the variable temperature <sup>7</sup>Li MAS-NMR spectrum of PEO<sub>6</sub>/LiTFSI remains consistent with a predominantly two-component system, where the broader component becomes narrower and increases in quantity with rising temperature.

The deconvolution of the <sup>7</sup>Li MAS-NMR spectra from Fig. 4 was performed to quantify the respective contributions from each component (cf. Table S7, ESI<sup>+</sup>). A two-component system is observed for PEO<sub>32</sub>/LiTFSI, comprising a minor contribution of faster lithium-ion dynamics as a narrower component at 40 °C (46%), increasing consistently up to 60 °C (63%), and subsequently increasing significantly as the temperature is increased to 70 °C (100%), notably transpiring at the melting phase transition temperature ( $T_{\rm m}$  = 56 °C). Considering that lithium-ions are preferentially solvated by PEO, as predicted by the RDF and MSD analyses from MD simulations, lithium-ion mobility is interlinked with PEO segmental motion, hence, two modes of lithium-ion transport are regarded: (1) lithium-ion transport via ion hopping between the coordination sites between different PEO chains or segments, or (2) lithium-ion transport without a change of coordination site and via segmental motion of the polymer.<sup>30,54,78,79</sup> Since PEO<sub>32</sub>/LiTFSI is a relatively dilute SPE system, and LiTFSI is entirely dissociated within the PEO matrix at 70 °C, the faster lithium-ion dynamics (narrower <sup>7</sup>Li MAS-NMR signals in Fig. 4) are evidently attributed to the Li<sup>+</sup>-PEO coordination, as detected by MD simulations and confirmed by Raman spectroscopy. Reviewing the Raman peak deconvolution results at 40 °C, LiTFSI is once again determined to be completely dissociated, inferring that the two-component lithium-ion dynamics deduced by NMR are solely attributed to lithium-ions coordinated to PEO, occurring by either one of the two lithium-ion transport modes. Based on MD simulations (cf. Fig. S6(b), ESI<sup>+</sup>) and similar MD simulations performed on PEO/LiTFSI systems from literature,54,78 lithium-ion mobility between different coordination sites between different PEO chains is faster than lithium-ion mobility arising by the lithium-ion coordination via PEO segmental motion. Therefore, the narrower component representing faster lithium-ion dynamics, occurs distinctly via lithium-ion transport between different PEO coordination sites and different polymer chains for PEO<sub>32</sub>/LiTFSI at 70 °C.

Continuing with this reasoning, it is interesting to note an opposite trend for PEO<sub>6</sub>/LiTFSI, with the minor contribution of faster lithium-ion dynamics from the two-component system proceeding to decrease with increasing temperature. However, considering the significantly lower number of PEO coordination sites present due to the high LiTFSI salt concentration, additional lithium-ion transport modes may prevail. Based on the lithium-ion transport mechanism deduced in Fig. S6(a)



Fig. 4  $^{7}$ Li MAS-NMR spectra for (a) PEO<sub>6</sub>/LiTFSI and (b) PEO<sub>32</sub>/LiTFSI at 40 °C, 50 °C, 60 °C, 70 °C, and 80 °C. The solid black line represents the recorded spectra, the dashed red lines represent the peak fitting, whilst the solid purple and cyan lines in (a), and the solid green and blue lines in (b), both respectively represent two distinct lithium-ion dynamics.

(ESI<sup>+</sup>) and a similar study performed for PEO/LiTFSI systems,<sup>54</sup> at high LiTFSI concentrations, lithium-ions preferentially coordinate with PEO due to the presence of ion pairs and ion clusters. However, despite this preference, the coordination of lithium ions to TFSI<sup>-</sup> anions enhances lithium-ion transport. Notably, ion pairs and ion clusters offer the most stable structure for transporting lithium cations, resulting in higher lithium-ion mobilities compared to lithium ions solely coordinated to PEO.<sup>54</sup> Consequently, the limited polymer segmental motion induced by the high LiTFSI concentration leads to the faster lithium-ion dynamics observed as a minority. At 40 °C, this minority constitutes 47%, decreasing to 32% at 70 °C. These faster lithium-ion dynamics are noticeably distinguished as lithium ions in the form of ion pairs and ion clusters. This observation finds further supported from MD simulations and Raman spectroscopy, where the minority of the lithium ions is found to be associated with TFSI<sup>-</sup> anions.

Considering that temperatures higher than the  $T_{\rm m}$  of the PEO<sub>6</sub>/LiTFSI SPE lead to a greater presence of amorphous regions, facilitating predominantly favoured lithium-PEO coordination, there is an observed increase in slower lithium-ion dynamics (reaching 68% at 70 °C). This observation is further confirmed by Raman spectroscopy, which indicates the presence of dissociated LiTFSI species, and MD simulations, which show Li<sup>+</sup>–PEO coordination.

Ascertaining the accuracy of the model's ability to predict the effects of concentration on the lithium-ion transport, studying the temperature dependence of the ionic conductivity may convey information about the primary charge carriers and their transport properties within the studied systems. The Arrhenius plot in Fig. 5(a) displays the ionic conductivity of the studied PEOn/LiTFSI systems at 40 °C and 70 °C. The semicrystalline nature of PEO is apparent since the ionic conductivities at 40 °C, a lower temperature than the melting phase transition temperatures (cf. Table S5, ESI<sup>+</sup>), are significantly lower compared to the ionic conductivities at 70 °C, at which completely amorphous behaviour of the SPEs are observed. Observing the effect of LiTFSI concentration, at temperatures lower than the melting phase transition, i.e., 40 °C, both the crystallinity degree and the extent of LiTFSI concentration are factors which may affect the ionic conductivity. An increased crystallinity degree signifies an increased fraction of ordered polymer chains, decreasing ionic conductivity, whilst an upsurge in LiTFSI concentration may produce increased ion-ion interdependent interactions, generally restricting ion mobility to a greater magnitude. This rationale follows for more concentrated SPEs, where PEO<sub>6</sub>/LiTFSI possesses lower ionic conductivity (4.2  $\times$  10<sup>-6</sup>  $\pm$  7.7  $\times$  10<sup>-7</sup> S cm<sup>-1</sup>) compared to highly diluted PEO<sub>64</sub>/LiTFSI (1.6  $\times$  10<sup>-5</sup>  $\pm$  26  $\times$  10<sup>-6</sup> S cm<sup>-1</sup>). Regarding moderately dilute systems, a trend of increasing

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**Fig. 5** (a) Temperature dependence of the ionic conductivity for  $PEO_n/LiTFSI$  SPEs with varying LiTFSI salt concentration. (b) Histogram illustrating the total (solid) and Li<sup>+</sup> (stripe) ionic conductivity with error bars, and lithium-ion transference number (blue) of  $PEO_n/LiTFSI$  SPEs, where n = 6, 16, 20, 32, or 64, at 70 °C.

ionic conductivity with increasing LiTFSI content is apparent, with PEO<sub>32</sub>/LiTFSI ( $2.0 \times 10^{-5} \pm 6.2 \times 10^{-6}$  S cm<sup>-1</sup>) displaying slightly lower ionic conductivity compared to PEO<sub>20</sub>/LiTFSI ( $4.0 \times 10^{-5} \pm 8.9 \times 10^{-6}$  S cm<sup>-1</sup>), while PEO<sub>16</sub>/LiTFSI exhibits the highest ionic conductivity ( $1.7 \times 10^{-4} \pm 4.0 \times 10^{-5}$  S cm<sup>-1</sup>). At a higher temperature of 70 °C, the ionic conductivities of the studied SPE systems are relatively comparable and fall within a range of  $4.0 \times 10^{-4} - 1.6 \times 10^{-5}$  S cm<sup>-1</sup>, for PEO<sub>6</sub>/LiTFSI and PEO<sub>16</sub>/LiTFSI, respectively. The comparative ionic conductivity is attributed to enhanced ion transport in the amorphous regions of the SPEs. This improvement arises from increased polymer free volume and improved segmental motion of the polymer chains in the amorphous phase.

Delving further into the ion dynamics, the total ionic conductivity,  $\sigma_{total}$ , and lithium-ion conductivity,  $\sigma_{Li^+}$ , is provided in Fig. 5(b). By comparing the contribution of the lithium-ion conductivity to the total ionic conductivity, the effect of LiTFSI concentration on the ion transport is apparent. PEO<sub>16</sub>/LiTFSI possesses both the highest total and lithium-ion conductivity, with PEO<sub>20</sub>/LiTFSI following closely behind. It may be interesting to highlight that PEO<sub>32</sub>/LiTFSI and PEO<sub>64</sub>/LiTFSI display comparable  $\sigma_{total}$  and  $\sigma_{Li^+}$ , albeit the latter is almost twice as dilute as the former. Based on the MD simulations, MSD and self-diffusion coefficient analyses predicted comparable ion transport properties for PEO<sub>20</sub>/LiTFSI and PEO<sub>32</sub>/LiTFSI, although slightly lower for PEO<sub>16</sub>/LiTFSI. This discrepancy may be due to several factors: (1) the polymer chain length utilized in the MD simulations (40 PEO chains with 24 EO units per chain, translated into a  $M_{\rm w}$  of approximately 1,056 g mol<sup>-1</sup>) may not accurately represent the performance of experimentally measured SPEs (PEO chains with a of  $M_{\rm w}$  of 5  $\times$  10<sup>6</sup> g mol<sup>-1</sup>); (2) a higher solvent polarity may result in a system consisting of primarily free ions solvated by PEO, which may yield higher self-diffusion coefficients within the polymer matrix; (3) partial charges and charge density may differ depending on the partial charge calculation method; and (4) time and length scales of the simulation adapted to meticulously describe the experimental system may induce additional computational cost.

Now, drawing attention to the lithium-ion transference number. Firstly, the lithium-ion transference number determined experimentally via EIS,  $T_{\mathrm{Li}^+}^{\mathrm{EIS}}$ , is different than the lithium-ion transport number,  $t_{Li^+}^{MD}$ , calculated previously from MD simulations. The former is based on chronoamperometry, deducing the number of moles of lithium-ions migrating per Faraday of charge, which may include contributions from free Li<sup>+</sup> ions, ion pairs, ion triplets or ion clusters.<sup>27,54,70,78</sup> The calculation of the lithium-ion transport number based on MD simulations,  $t_{\text{I}\,\text{i}^{+}}^{\text{MD}}$ , is conducted by analyzing the averaged displacements and their self-diffusion coefficients, or proportion of current carried by the ionic species within the polymer matrix, *i.e.*, free Li<sup>+</sup> or TFSI<sup>-</sup> ions. Based on Fig. 5(b), the overall trend of the lithium-ion transference number follows a higher  $T_{\rm Li^{\pm}}^{\rm EIS}$  with decreasing LiTFSI salt concentration, similar to values deduced from MD simulations (*cf.* Table S4, ESI†), albeit slightly higher. The slightly higher predicted  $t_{\text{Li}^{+}}^{\text{MD}}$  values may be due to the deviation of the force field based on various factors, as discussed earlier. PEO<sub>16</sub>/LiTFSI, PEO<sub>20</sub>/LiTFSI, and  $PEO_{32}/LiTFSI$  display similar  $T_{Li^+}^{EIS}$  values. A lower  $T_{Li^+}^{EIS}$  for highly concentrated PEO<sub>6</sub>/LiTFSI compared to the aforementioned SPEs is attributed to the overall restricted lithium-ion mobility related to the lower lithium-ion ionic conductivity, which introduces more charge carriers and decreases ionic conductivity,68,69 whereas highly diluted PEO<sub>64</sub>/LiTFSI exhibits a higher  $T_{\text{Li}^+}^{\text{EIS}}$  due to higher polymer free volume, facilitating faster ion mobility.

**3.1.3.** Comparing the predicted model to experimental results. Compiling both computational and experimental data, Table 1 summarizes both the lithium-ion coordination and lithium-ion transport properties for concentrated  $PEO_6/LiTFSI$  and dilute  $PEO_{32}/LiTFSI$  at 70 °C. MD simulations of dilute  $PEO_{32}/LiTFSI$  forecasted one dominant lithium-ion speciation type at 70 °C, Li<sup>+</sup> $-O^-(PEO)$  coordination (99%), with a minor

Table 1 Summarized data comparing the predicted ion coordination structures from MD simulations to experimental techniques, including Raman and MAS-NMR spectroscopies, performed at 70 °C

	MD simulations		Raman spectroscopy		<sup>7</sup> Li MAS-NMR spectroscopy	
EO/Li <sup>+</sup> ratio 70 °C	Li <sup>+</sup> –PEO coordination (%)	Li <sup>+</sup> –TFSI <sup>–</sup> –PEO coordination (%)	Dissociated LiTFSI (%)	Associated LiTFSI (%)	Narrower component (faster Li <sup>+</sup> -ion mobility) (%)	Broader component (slower Li <sup>+</sup> -ion mobility) (%)
6:1 32:1	77 99	23 1	$\begin{array}{c} 77\pm2\\ 100\pm3 \end{array}$	$\begin{array}{c} 23 \pm 7 \\ 0 \end{array}$	32 100	68 0

 $Li^+ - O^-(^{TFSI^-}_{PEO})$  coordination type (1%). Experimental techniques, such as Raman spectroscopy, validated the extent of LiTFSI salt association as a function of LiTFSI salt concentration by inspecting the *S*–*N*–*S* vibration, where solely dissociated LiTFSI was found, further examined by MAS-NMR spectroscopy to possess faster lithium-ion dynamics. Therefore, for diluted SPEs, the lithium-ions coordinated to PEO in the form of free Li<sup>+</sup> ion follows faster lithium-ion transport, diffusing *via* an ion-hopping mechanism between different PEO chains and segments.

In the case of PEO<sub>6</sub>/LiTFSI, MD simulations predicted two distinct lithium-ion coordination environments, predominantly  $\text{Li}^+-\text{O}^-(\text{PEO})$  (77%), and a minor  $\text{Li}^+ - \text{O}^-(\stackrel{\text{TFSI}^-}{\text{PEO}^-})$  coordination (23%). Raman spectroscopy validated the findings from MD simulations, as a majority of free TFSI<sup>-</sup> ions (77 ± 2%) and a minority of contact ion pair form (23 ± 7%). Further analysis of the lithium-ion dynamics by MAS-NMR lead to the determination of two distinct components as the temperature

rose from 40 °C to 80 °C; faster lithium-ion dynamics (32%), and slower lithium-ion dynamics (68%) at 70 °C. Since lithiumions are preferentially solvated by PEO,  $\text{Li}^+-\text{O}^-(\text{PEO})$  remains the dominant speciation, however, these lithium-ions possess slower lithium-ion dynamics. Although a minor contribution,  $\text{Li}^+-\text{O}^-(\frac{1\text{TSI}^-}{\text{PEO}})$  speciation facilitates faster lithium-ion dynamics, since ion pairs and ion clusters are more stable structures for lithium-ion transport compared to PEO.<sup>54</sup> Notably, the crucial difference in analyzing how ion coordination affects ion transport and dynamics requires consideration of the salt concentration.

The prediction of both ion coordination and transport based on MD simulations was successfully validated by utilizing experimental techniques such as Raman, MAS-NMR, and EIS. This model may aid the examination of cation effects on the ion coordination and transport properties of alternative alkali metal solid polymer electrolytes, as we examine in the following section.



**Fig. 6** Lithium-ion coordination for  $PEO_{20}/XTFSI$  systems, where X = Li, Na, K, and Cs. RDFs (solid lines) and CNs (dashed lines) between (a) different cations and oxygen atoms of the EO units from PEO, and (b) oxygen atoms from TFSI<sup>-</sup> ions, at 70 °C. (c) SDFs representing the coordination between the EO units from PEO (ball and stick) and cations (surface volume), from left to right: Li<sup>+</sup> (blue), Na<sup>+</sup> (green), K<sup>+</sup> (yellow), and Cs<sup>+</sup> (red) cations.

# 3.2. Beyond lithium-based batteries: sodium, potassium, and cesium

The validation of the  $\text{PEO}_n/\text{LiTFSI}$  computational framework allows for its extension to other cations beyond lithium-ion batteries, by substituting lithium with sodium, potassium, or cesium cations. Alternative solid-state electrolytes based on extensively studied PEO may be modelled, such as  $\text{PEO}_{20}/\text{NaTFSI}$ ,  $\text{PEO}_{20}/\text{KTFSI}$ , and  $\text{PEO}_{20}/\text{CsTFSI}$ , towards the realization of alkali metal batteries.

Addressing ion coordination, RDFs and respective CNs of the studied  $PEO_{20}/XTFSI$  systems were computed by analyzing the coordination between the alkali metal cations and the oxygen atoms from both PEO and  $TFSI^-$  ions, presented in Fig. 6(a) and (b), respectively. The first peak of the RDFs in Fig. 6(a) indicates that the coordination distance between the cation and the EO units increases with cation size, from 2.1 Å for lithium-based PEO<sub>20</sub>/LiTFSI, to 3.1 Å for cesium-based PEO<sub>20</sub>/CsTFSI. Additionally, the number of coordinated oxygen atoms in the first coordination shell, indicated by the width of the first peak in the RDF, increases from 6 for PEO<sub>20</sub>/LiTFSI and 7 for  $\text{PEO}_{20}/\text{NaTFSI},$  to 8 for both  $\text{PEO}_{20}/\text{KTFSI}$  and  $\text{PEO}_{20}/\text{CsTFSI}.$ 

In the case of cation-anion coordination, the RDFs representing the cation coordination with TFSI<sup>-</sup> ions, plotted in Fig. 6(b), display CN values close to zero for the first coordination shell, which indicates nearly complete dissociation, irrespective of the cation nature. This observation aligns well with the decrease in dissociation energies observed in calculations of X-TFSI clusters in the gas-phase, as the cationic size increases.<sup>80</sup>

Moreover, the computed spatial distribution functions (SDFs) in Fig. 6(c) indicates stronger coordination between the lithium cation and the PEO chains, due to the presence of three lobes as the surface volume. The remaining cations, however, display a different surface volume, observed as single lobes at larger distances from the EO monomers the larger the cation size. These findings verify the complete dissociation predicted by RDF analyses. The preferential cation-PEO coordination observed for all cations demonstrates a stronger cation-PEO coordination for smaller cations, attributed to the shorter distance between the respective cation and the oxygen atoms



**Fig. 7** Ionic conductivity of the (a)  $PEO_{20}/XTFSI$  systems, where X = Li, Na, K, or Cs, at different temperatures. Comparison of MD simulated (solid line) and experimentally obtained (dashed line)<sup>80</sup> ionic conductivities, including this study (pink) (PEO<sub>20</sub>/LiTFSI), for (b)  $PEO_{20}/LiTFSI$  (blue), (c)  $PEO_{20}/NaTFSI$  (green) and (d)  $PEO_{20}/KTFSI$  (orange) SPE systems.

from PEO, which may hinder cation transport due to increased intermolecular forces.

Fig. 7(a) displays the ionic conductivities of the modelled  $PEO_{20}/XTFSI$  systems. Additionally, Fig. 7(b)–(d) illustrates experimentally obtained values for  $PEO_{20}/LiTFSI$ ,  $PEO_{20}/NaTFSI$ , and  $PEO_{20}/KTFSI$ , respectively.<sup>80</sup>

The ionic conductivities of the four alkali metal based SPEs show similar trends, as inferred from Fig. 7(a). Notably,  $PEO_{20}/LiTFSI$ ,  $PEO_{20}/NaTFSI$ , and  $PEO_{20}/KTFSI$  possess similar ionic conductivity values, while  $PEO_{20}/CsTFSI$  displays the highest ionic conductivity. This result may be surprising, as similar ion transport for cations of different sizes and masses seem contradictory. However, this contradiction can be solved by referring to the weaker cation coordination to the PEO chains, as discussed earlier: larger cations coordinate to the EO monomers at greater distances, favouring weaker cation coordination and faster cation transport.

At temperatures higher than the  $T_{\rm m}$  of PEO, the ionic conductivities for PEO<sub>20</sub>/LiTFSI, PEO<sub>20</sub>/NaTFSI, and PEO<sub>20</sub>/ KTFSI predicted by the simulations and those determined by experiments<sup>80</sup> are in good agreement, proving the accuracy of the model at temperatures above the melting point of PEO. However, at temperatures lower than 50 °C, the theoretical ionic conductivities differ to experimental values. This is attributed to the semicrystalline nature of PEO present at temperatures below its phase transition temperature, which impedes ion transport due to the lower degree of amorphous regions, resulting in lower ionic conductivity. Classical MD simulations model molecular kinetics, with limited ability to simulate morphological changes, such as semi-crystallinity, hence, the discrepancy with experimental values, observed for all three alkali metal based SPEs.

Fig. 8 displays the cation transport numbers for the investigated PEO<sub>20</sub>/XTFSI systems. While no distinct trend can be readily inferred from these values, PEO<sub>20</sub>/NaTFSI exhibits the highest cation transport number across most of the studied temperatures. This finding aligns well with previous experimental reports in the literature, where a cation transport



Fig. 8 Cation transport numbers of the  $PEO_{20}/XTFSI$  systems as a function of temperature, where X = Li, Na, K, and Cs.

number as high as 0.66 for Na-ions was observed in a PEO/ NaTFSI system.<sup>80</sup> At temperatures higher than 60 °C, the  $t_{Cs^+}^{MD}$  numbers are generally higher than the cation transport numbers observed for either lithium or potassium over the studied temperature range. This implies greater cationic conductivity for both Na- and Cs-based SPEs. It is interesting to note that the  $t_{Li^+}^{MD}$  is found to be slightly higher for PEO<sub>20</sub>/LiTFSI using LAMMPS compared to Gromacs, (*cf.* Fig. 8 and 2a, respectively).

The activation energies of the transport mechanisms were calculated by fitting the ionic conductivity data shown in Fig. 7(a) to the Arrhenius equation (*cf.* eqn (S2) and Fig. S9, ESI $\dagger$ ). Similar activation energy values were obtained for the four investigated cations, suggesting that the ion transport mechanism is independent of cation size.

In summary, the ion conductive properties of the studied alkali metal salts in the PEO matrix show no significant differences in order of magnitude, ascribed to the structural properties of the system, whereby larger cation sizes result in weaker coordination with the polymer chains from PEO. As a result, the greater mass of these cations is compensated for by the weaker cation coordination, making the studied sodium, potassium, and cesium systems equally suitable as polymer electrolytes compared to their lithium counterpart. These findings suggest that the use of sodium, potassium, or cesium SPEs used in alkali metal or alkali-ion batteries, utilizing sodium, potassium, or cesium as their primary charge carriers, may exhibit similar bulk electrolyte performance compared to lithium-based SPEs.

### 4. Conclusion

In moderately to highly diluted  $PEO_n/LiTFSI$  systems ( $n \ge 16$ ), fully dissociated LiTFSI was found using MD simulations, while PEO<sub>6</sub>/LiTFSI exhibited some extent of ion pairing, as inferred by RDF analysis. Lithium-ion speciation in PEO revealed two coordination types:  $Li^+-O^-(PEO)$  and  $Li^+-O^-(^{TFSI^-}_{PEO})$ , with the former in more dilute PEOn/LiTFSI systems and the latter exclusively in concentrated PEO<sub>6</sub>/LiTFSI. Raman spectroscopy confirmed the MD simulations' predictions, showing either free TFSI<sup>-</sup> ions (dissociated LiTFSI) or contact ion pairs (associated LiTFSI). MAS-NMR was further utilized to study the lithium-ion dynamics at varying temperatures for PEO<sub>32</sub>/LiTFSI and PEO<sub>6</sub>/LiTFSI, which consistently exhibited two distinct lithium-ion dynamics, continuously present for PEO<sub>6</sub>/LiTFSI regardless of the temperature, while one component disappeared at temperatures above 60 °C for PEO32/ LiTFSI. Different ion transport mechanisms were observed depending on the LiTFSI salt content in the SPE.

Moderately and highly dilute systems ( $n \ge 16$ ) had free Li<sup>+</sup> ions diffusing *via* ion-hopping between coordination sites of different PEO chains. Concentrated PEO<sub>6</sub>/LiTFSI showed associated LiTFSI species, limiting lithium-ion mobility due to the lack of available PEO coordination sites. However, despite lower lithium-ion mobility in PEO<sub>6</sub>/LiTFSI than SPEs with  $n \ge 16$ , we found that concentrated PEO<sub>6</sub>/LiTFSI exhibited faster ion dynamics through ion pairs and clusters compared to lithiumion transport *via* PEO coordination sites.

When considering ion coordination and transport mechanism for alternative alkali metal-ions (sodium, potassium, and cesium) at a fixed EO/X<sup>+</sup> ratio of 20:1, we found that the cation coordination distance increased with larger cations due to their increased volume. However, all studied alkali metal-salts consistently experienced complete dissociation, attributed to PEO's strong solvating ability. Substituting cations in the PEO matrix showed comparable coordination numbers (ranging from 5 to 8) for lithium, potassium, and cesium ions. PEO's solvating ability seemed to reach its limit for larger cations like potassium (with an atomic radius of 2.31 Å), resulting in similar CNs for potassium and cesium (with an atomic radius of 2.62 Å).

MD simulation results for ionic conductivity agreed well with experimental data for  $PEO_{20}/LiTFSI$ ,  $PEO_{20}/NaTFSI$ , and  $PEO_{20}/KTFSI$  at temperatures of 50 °C and above.  $PEO_{20}/CsTFSI$ exhibited higher ionic conductivity due to weaker coordination between Cs ions and PEO, enhancing cationic mobility. Additionally, cationic transport number analysis showed sodiumion having the highest cation transport number among the studied cations over the entire temperature range, indicating an optimal balance between cation coordination with PEO and NaTFSI salt dissociation.

In conclusion, the design of novel SPEs should consider not only the extent of salt dissociation but also the type of coordination structures present, as these factors influence charge carrier mobility, allowing tuning of ionic conductivity and cation transport numbers. Our MD simulation-based framework accurately predicted LiTFSI salt association with concentration and facilitated the investigation of alternative alkali metal ions, revealing the impact of cation size on ion dynamics and transport. Finding a balance between cation size and salt dissociation is crucial for advancing the design of novel polymer electrolytes for all-solid-state batteries.

## Author contributions

The manuscript includes computational and experimental experiments performed by B. A. F. (Section 3.1), and computational experiments by J. O. (Section 3.2). The manuscript was primarily written by B. A. F., with additions by J. O. (Section 3.2). H. M., M. M.-I. and J. C. provided conceptualization and supervision of the work. Reviewing and editing was performed by all the authors.

# Conflicts of interest

There are no conflicts to declare.

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