

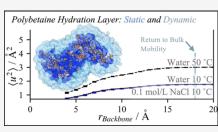
#### Article

# Molecular Dynamics Simulation of the Influence of Temperature and Salt on the Dynamic Hydration Layer in a Model Polyzwitterionic Polymer PAEDAPS

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ABSTRACT: We	e investigate the hydration of 1	oly(3-[2-(acrylamido) ethyldimethy-	Polybetaine Hydration Layer: Static and Dynamic

**ABSTRACT:** We investigate the hydration of poly(3-[2-(acrylamido) ethyldimethylammonio] propanesulfonate) over a range of temperatures in pure water and with the inclusion of 0.1 mol/L NaCl using atomistic molecular dynamics simulation. Drawing on concepts drawn from the field of glass-forming liquids, we use the Debye–Waller parameter ( $\langle u^2 \rangle$ ) for describing the water mobility gradient around the polybetaine backbone extending to an overall distance  $\approx 18$  Å. The water mobility in this layer is defined through the mean-square water molecule displacement at a time on the order of water's  $\beta$ -relaxation time. The brushlike topology of polybetaines leads to two regions in the dynamic hydration layer. The inner region of  $\approx 10.5$  Å is explored by pendant group



conformational motions, and the outer region of  $\approx$ 7.5 Å represents an extended layer of reduced water mobility relative to bulk water. The dynamic hydration layer extends far beyond the static hydration layer, adjacent to the polymer.

# 1. INTRODUCTION

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Applications of polybetaine materials in biomedical, filtration, and drug delivery fields continue to grow steadily.<sup>1-17</sup> Zwitterionic polymers of this kind contain both anionic and cationic functionality within a monomer's pendant group, giving rise to overall charge neutrality of this class of polymers and a tendency to strongly complex with water. In particular, the combination of their high charge density and inherent charge neutrality has led to important applications of polybetaines in creating materials with stimuli-responsive, antibiofouling, and low friction properties.<sup>1-16</sup> In particular, the stimuli-responsiveness of polybetaines, in combination with their biocompatibility, makes these materials of immense interest in developing vehicles for drug delivery  $^{8-12}$  and for membrane filtration  $^{13-16}$  applications. Property changes due to changes in thermodynamic conditions or solution composition often result from four main stimuli that have been emphasized: pH, temperature, salt type, and salt concentration. Temperature and pH sensitivity of these polymers are often the basis for drug-delivery application-based micellar<sup>8-10</sup> and hydrogel<sup>11,12</sup> forms of these materials, while salt responsiveness is often utilized in connection with self-cleaning<sup>13,14</sup> and sizeselective<sup>15,16</sup> polyzwitterion membrane materials for protein purification. Each applied stimulus type has been interpreted as arising from the interference with betaine-betaine (i.e., pendant-pendant) associative interactions, resulting in striking reductions in hydrogel mechanical properties (i.e., storage and loss moduli<sup>18</sup>) of these materials, the expansion of the polybetaine chains in grafted layers,<sup>19</sup> or the dissolution of polybetaine polymers in solution.<sup>20</sup> Phase diagrams of polybetaine solutions exhibit liquid-liquid phase separation

upon cooling,<sup>21</sup> rather than the more commonly encountered phase separation upon heating found in common water-soluble polymers, such as polyethylene oxide and poly(*n*-isopropylacrylamide) (pNIPAM).<sup>22</sup> Polybetaine and other polyzwitterion polymers evidently have many solution properties that are different from other water-soluble polymers, which account for their niche applications. Once the driving force behind the attractive polybetaine behaviors is fully understood, potential applications associated with a combination of the responsive properties of polyzwitterionic polymers with the supra-molecular assembly characteristics of block copolymers may continue to develop from preliminary studies.<sup>8,10</sup>

As noted earlier, polybetaines are also of particular interest for their antifouling applications of technological interest in the biomedical<sup>1,2</sup> and membrane filtration<sup>3–5</sup> fields. In particular, sulfobetaine methacrylate (SBMA) polyzwitterionic polymers have been shown to form ultralow biofouling surfaces when grafted to a surface with a sufficient high density.<sup>3,6</sup> Several studies have indicated that sulfobetaine hydrogel materials<sup>1,2</sup> and polymer brush films<sup>5,7</sup> can be highly resistant to nonspecific protein binding, making these materials attractive as suitable materials for medical implants.<sup>1,11</sup> The presence of a strong hydration layer in polybetaine brush films has been offered as an explanation of the characteristically low friction in

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polymer layers of this kind.<sup>23,24</sup> While the properties of sulfobetaine materials are often attributed to strong hydration, the actual physical origin of these effects and even the physical nature of the hydrating layer remain imperfectly understood. Since applications of the unique stimuli-responsive and antifouling properties of polybetaine and other polyzwitterion polymers are highly prized, the present work focusses on the quantification of the hydration layer in this class of polymers, especially the dynamics of the hydration layer.

Simulation studies of polybetaine stimuli response properties are limited and have tended to emphasize the role of hydration on the antifouling properties of this class of polymers. Coarsegrained simulations<sup>23</sup> have considered competitive self- and solvent-interactions of polybetaines in relation to understanding qualitative trends in their stimuli-responsive properties. Recently, simulation studies have begun to focus on the physical nature of polybetaine hydration.  $2^{5-27}$  As a starting point, the biosourced betaine, glycine, has served as a model system for understanding how molecular structure and chemistry influence hydration with a view of identifying factors that might be controlled in order to create more effective antifouling surfaces.<sup>27</sup> This work indicated structural evidence for a hydration layer that extended 1.5 or 2 water layers (i.e., solvation shells) around the betaine molecule, based on a local tetrahedral order parameter appropriate to water, suggesting a hydration layer thickness on the order of a few angstroms. These simulations also claimed evidence supporting that the presence of the polymer hydration layer reduced the strength of the polymer excluded volume interactions, a phenomenon inferred to be key for understanding the observed antifouling properties of these materials.<sup>27</sup> Another notable molecular dynamics (MD) study focusing on the interaction of lysozyme molecules with a high grafting density phosphorylcholine polymer brush layer identified the presence of a relatively longrange effective repulsive force between the protein and the polymer layer extending out to a distance of about 10 Å from the polymer grafted layer surface.<sup>28</sup> This work proposed that the long-range repulsive force resulted from the hydration layer, offering an additional clue about the nature of the hydration layer in these polymers. Notably, this last work indicated the existence of a hydration layer extending well beyond the immediate interfacial region around the polymer where the water structural organization is discernably altered from that of bulk water. The quantification of this less wellunderstood diffuse hydration layer is the focus of the present work.

It is becoming increasingly appreciated from accumulated studies of water-soluble polymers that hydration involves both a static hydration layer in the immediate proximity to the polymer moieties and a more extended vicinal or dynamical interfacial zone (i.e., dynamic hydration layer) in which the water dynamics are significantly altered from bulk water. Most quantitative studies of extended hydration layers have focused on proteins and lipid membranes so the generality of the phenomenon for other water-soluble polymers is currently unclear. Recent works<sup>25,26</sup> have emphasized the possible complex synergistic effects between hydration with competing interactions that influence protein–protein interactions. For example, some studies<sup>25,29,30</sup> have suggested a possible role in which the dynamic hydration layer of some proteins reduces the entropic penalty for intermolecular association, a phenomenon that might also be operative in polyzwitterion polymers. This proposed entropic contribution has also been

suggested in connection with co-ion interactions in simulations of polyelectrolyte association.<sup>31,32</sup> The current limited fundamental understanding of hydration and appropriate hydration metrics of this phenomenon makes further quantification difficult.

It has often been claimed that proteins are related to polyzwitterions,<sup>19,33</sup> and in accepting these arguments, it is natural to compare the solution properties of proteins to zwitterionic polymers for common observational trends in both classes of polymers. It is generally appreciated, for example, that the extended hydration layer of proteins can actively facilitate protein binding and folding, phenomena of profound biophysical importance.<sup>34-40</sup> Is there analogous behavior found in polyzwitterion polymers? The relatively high solvent mobility in the dynamic hydration layer on a picosecond timescale (THz frequency) has been found to be strongly coupled to the longer timescale conformational changes of proteins.<sup>35,40,41</sup> This observation points to the potential importance of picosecond dynamics of the hydration layer in polyzwitterionic polymers. It has been suggested that the protein hydration layer can give rise to long-range interactions between the proteins in solution, allowing these macromolecules to "see" each other at relatively large distances and to regulate both their binding<sup>30</sup> and targeted docking.<sup>41,42</sup>

Historically, the existence of an extended dynamic hydration layer was first observed in terahertz (THz) spectroscopic measurements of protein solutions, where the protein concentration was gradually increased until collective effects were observed.<sup>40,43</sup> The onset of these collective effects are interpreted to indicate a more rigid hydrogen bonding network<sup>44</sup> and are considered to result from the overlap of protein dynamic hydration layers with a thickness from 10 to 18 Å.<sup>40,43,45</sup> These pioneering THz spectroscopy measurements probing the dynamic interfacial layers of proteins and other biological molecules<sup>40,43,45,46</sup> have since been extended to other measurement methods such as femtosecond-resolved fluorescence<sup>44</sup> and dynamic neutron scattering<sup>47,48</sup> that confirm the same qualitive picture of a dynamic hydration layer having a thickness in the order of a nanometer, as we find below in our simulations of polybetaine polymers in solution.

Simulation studies have supported THz spectroscopic measurements on protein solutions. These simulation studies indicated a dynamic hydration layer ranging from 10 Å up to 12 Å,  $^{40,48,49}$  compared to spectroscopic estimations of a dynamic hydration thickness from 10 Å up to 18 Å $^{40,43,45}$  for the studied proteins and solution conditions. The methodology for identifying the dynamic hydration layer in these former simulations of protein solutions is rather involved and requires time-consuming computations, e.g., the calculation of the dipole/velocity autocorrelation function, <sup>40,48,49</sup> a property convoluted with the diffusion of the solvent. <sup>50,51</sup> There is evidently a need for a more computationally economical approach for elucidating the mobility gradient and for identifying a metric to discern the extent of dynamic hydration and the mobility gradient in this layer that can be more readily linked to measurements. We address this general problem by developing a methodology applicable for estimating the extent of the dynamic hydration layer, and moreover, this method even enables the direct and facile visualization of these layers in simulations of polymer solutions. It is our hope that this methodology will provide the basis of a general-purpose metrology for better identifying and quantifying the hydration

layers, allowing future studies to ascertain their effect on the properties of these solutions.

The connection between the picosecond timescale dynamics probed in THz spectroscopy measurements with processes occurring on much longer timescales requires some comment, even though this is not a new idea in either the protein $^{35,38-40}$ or polymer physics<sup>52,53</sup> literature. In particular, the solvent dynamics on the timescale of a picosecond has been observed to be strongly correlated with protein conformational changes and changes of enzyme activity.<sup>35,38-40</sup> In polymer physics, another connection between picosecond dynamics and relaxation/diffusion processes occurring on a vastly longer timescale where picosecond dynamic properties of the polymer fluid were found to be related to the  $\alpha$ -relaxation time,  $\tau_{\alpha}$ obtained from the intermediate scattering function.  $^{52,53}$  In these works, the picosecond dynamics involved was defined as the average mean squared atomic displacements of the polymer segments on a picosecond timescale (i.e.,  $\langle u^2 \rangle$  or the Debye-Waller parameter), suggesting that this quantity should be useful in quantifying the dynamics of the polybetaine hydration layer. Importantly, a similar correspondence between  $\tau_a$  and  $\langle u^2 \rangle$  has been observed for simulated bulk water,<sup>54</sup> as well as diverse other liquids, ranging from polymeric and metallic glass-forming liquids.<sup>30,55–57</sup> We then consider  $\langle u^2 \rangle$ , which is at least readily measurable in bulk materials, as providing a suitable and easily computed metric for quantifying local mobility in the hydration layer and complex fluids generally.<sup>30,52-57</sup> In a related pioneering work based on this idea,  $\langle u^2 \rangle$  estimates for water molecules allowed the visualization of the water mobility field around amyloid fibrils.<sup>30</sup> Moreover, in a previous work, it has been observed that contributions to the vibrational density of states, corresponding to a picosecond timescale or to a THz frequency range, can be used to discern bound, unbound, and free water around a solvated enzyme.<sup>51</sup> The present work is distinct from these previous studies, emphasizing fast THz dynamics in its focus on  $\langle u^2 \rangle$  to quantify the mobility within the dynamic hydration layer around the polybetaine polymers. The metric,  $\langle u^2 \rangle$ , is a computationally accessible means of quantifying liquid mobility that can be measured experimentally by a variety of methods for the whole material and readily estimated by simulation. This property exhibits a strong correlative interrelationship to the rate of structural relaxation and diffusion processes occurring on much longer timescales.

This work utilizes all-atom molecular dynamics (AA-MD) to analyze the hydration layer of poly(3-[2-(acrylamido) ethyldimethylammonio] propanesulfonate) (PAEDAPS) with and without 100 mmol/L NaCl at several temperatures from 10 to 50 °C. We were initially motivated to simulate this polymer in 100 mmol/L solution by observations from Delgado and Schlenoff,<sup>58</sup> in which a striking drop in the apparent  $R_{\rm h}$  of this polymer was reported with the addition of salt to the polymer solution. This effect was attributed by them to a change in the polymer hydration layer. To allow for a feasible computation, the polybetaine molecule was represented as a 30 repeat unit chain to mitigate the effect of self-interactions that are prevalent in longer polymers, which can greatly alter chain conformational structures. This constraint to relatively short chains allows us to focus on the solvation dynamics around the polymer, but limits our study of how the chain dimensions are altered with the addition of salt, one of the outstanding questions about this class of polymers. We find that the addition of salt can influence the dynamics within the

polybetaine dynamic hydration layer. Moreover, we find that the dynamic hydration layer can be naturally decomposed into an interfacial region around the polymer backbone in which the water mobility is greatly influenced by the movement of the brushlike pendant groups of the polybetaine polymers and an additional region beyond this layer in which the water mobility is significantly altered.

We begin by defining our methods in Section 2, followed by our results in Section 3. Our work considers three solvent regimes about the polybetaines polymers, the first being bulk solvent. Second, there is water directly associated with the polymer pendant groups and, correspondingly, we quantify the length scale of pendent group extension from the chain backbone in Section 3.1. We also estimated the probability distribution of the number of monatomic ions among the pendant groups at a particular moment in time because of their potential relevance to the intermolecular interactions of charged polymers, including polyzwitterions.<sup>31,32</sup> The third regime represents the region between the bulk and space sampled by the polymer pendants, which is a vicinal region of dynamically altered water. In Section 3.2, we determined  $\langle u^2 \rangle$ in order to define the transition from the vicinal region to the bulk solvent with the overall thickness of the dynamic hydration layer and the water mobility gradient within this layer. Section 3.3 characterizes the water residence time in the dynamic hydration layer, a quantity previously studied in connection with defining water strongly bound to biomolecules.<sup>59</sup> Because the variation in hydration stability with respect to changes in stimuli or chemistry are often attributed to changes in functional group stiffness,<sup>44,50,60</sup> Section 3.4 uses the Debye–Waller parameter  $\langle u^2 \rangle$  to again assess the influence of stimuli effects on polymer functional group mobility. Lastly, Section 3.5 includes the hydrogen bond analysis between polybetaine and water, as this analysis of the static hydration layer is the standard methodology of probing hydration effects.<sup>27,44,60–66</sup>

### 2. METHODOLOGY

2.1. Simulation Details. This work models a polybetaine system with an atomistic MD approach. Three independent boxes allowed for statistical analysis and were built at each temperature and salt concentration with the MosDef<sup>‡</sup> suite (i.e., mbuild<sup> $\ddagger,67$ </sup> and foyer<sup> $\ddagger,68$ </sup>). Each box then contains an independently generated atactic polymer (sequences shown in Section S1) with a 30 repeat unit degree of polymerization, solvated with 26,875 water molecules, and when applicable, 42 NaCl pairs. Water is represented with the transferable intermolecular potential four point model parametrized to include long-range Ewald summations of charge interactions, i.e., the TIP4P-Ew model,<sup>69</sup> and NaCl with the corresponding parameters for the Joung and Cheatham<sup>70</sup> monovalent salts, which together serve as a prominent electrolyte model that is sufficiently representative of water dynamics and simultaneously spans the monatomic ion series. This choice will allow future comparison of this work with other salt combinations. However, TIP4P-Ew is known to slightly underperform in comparison to TIP4P/2005,<sup>71</sup> which is equipped with a more limited series of ions.<sup>72</sup> The polybetaine, PAEDAPS, is modeled with the generalized forcefield, optimized potentials for liquid simulations (OPLS-AA)<sup>73,74</sup> with the expansion of sulfonate parameters.<sup>75</sup> Ammonium parameters were obtained from the Enhanced Monte Carlo<sup>‡,76</sup> package, in which they were included and substantiated through personal communi-

cation with the Jorgensen group. The parameters for the Joung and Cheatham ions and TIP4P-Ew water interact using Lorentz-Berthelot (LB) combining rules, while the OPLS-AA forcefield uses geometric combining rules. We then explicitly set the ion-water cross-interaction parameters according to the values obtained from the LB combining rules and adopted the geometric combining rules for interactions between OPLS-AA and TIP4P-Ew water or the ions. This strategy was recommended by Joung and Cheatham<sup>70</sup> and substantiated with the use of their ion parameters for use with SPC/E water and the OPLS-AA forcefield in a recent work.<sup>77</sup> However, it should be recognized that studies involving the GAFF atomistic forcefield found that in aqueous solutions with organic ions and salt, the solvent structure was sensitive to specially tuned parameters,<sup>78</sup> taking such system specific deviations into account could be considered with a nongeneralized forcefield in a future work.

MD simulations were carried out with the Large-scale Atomic/Molecular Massively Parallel Simulator (LAMMPS)<sup>‡,79</sup> using periodic boundary conditions and 1 fs timesteps. Long-range electrostatics were treated using a particle-particle particle-mesh solver<sup>80</sup> with a relative error of 0.0001. Three independent configurations for each temperature condition ranging from 10 to 50 °C in increments of 10 °C were equilibrated for 1.5 ns with constant temperature and atmospheric pressure (NPT at 101325 Pa = 1 atm), the last 1 ns was used to calculate the equilibrium box size for subsequent simulations in the canonical ensemble (NVT), 93 Å. After 6 ns of equilibration, a 5 ns production run was used for the analysis in our work, as dynamic properties are most reliably represented in the NVE and NVT ensembles.<sup>81,82</sup> This equilibration process is sufficient to reach an equilibrium state for the aqueous solution (structural relaxation of approximately 1 ps),<sup>83</sup> without allowing conformational changes in the polymer to obfuscate our analysis of the static hydration layer, as seen in Section S3 of the Supporting Information. The Nose-Hoover thermostat and barostat were utilized with respective dampening factors of 100 °C and 1000 atm, where applicable. The trajectory was recorded every 10 fs for 50 ps for the total hydrogen bond lifetimes, every 1 ps for 2 ns for intermittent hydrogen bond lifetimes, and the entire production run for all other properties.

2.2. Analysis of Dynamic Properties. The results of this work were produced with MDAnalysis,<sup>‡,84,85</sup> with the exception of partial radial distribution functions used for cutoff values, which were computed in LAMMPS. Of the results presented below, two aspects require further clarification. For the first aspect, Sections 3.1-3.3 involve properties of atoms/ molecules at some radial distance from the polymer backbone. Because the backbone moves, neither a cylindrical nor spherical shape is appropriate; thus, an isolayer selection method has been contributed to MDAnalysis to allow this flexible zone to be obtained, as depicted in Section S4. These radial metrics were used to define and discuss the extent of distributions of ions and the dynamic hydration layer to facilitate a contrast with metrics specific to the static hydration layer. Here, we provide a visualization of the two hydrating components in Figure 1, and the complement of this figure, defining the length scales involved, is shown with our conclusions. The static hydration layer (first hydration shell) is defined with a cutoff taken from the first minimum in the pair-correlation functions between hydrophilic species and water, leading to a tight surrounding layer in direct contact

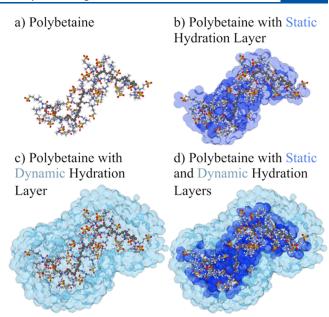


Figure 1. Visualization of (a) polybetaine, (b) polymer with the static hydration layer (first hydration shell), (c) polymer with the dynamic hydration layer, and (d) polymer with both static and dynamic hydration layers.

with polybetaine. Similarly, the second hydration shell is defined from the second minima in the radial distribution function: the first and second minima are tabulated in Section S8. The dynamic hydration layer is defined by a length scale radially distant from the backbone. Thus, the defining difference between these layers is that the static hydration layer is touching the polymer and the dynamic hydration layer experiences a hindered mobility from the influence of the polymer.

The static hydration layer (first hydration shell, immediately adjacent to the hydrophilic moieties) and its response to changes in system conditions is traditionally studied with a hydrogen bond analysis (HBL). In particular, hydrogen bond analysis involves two quantities, the continuous and intermittent lifetime, which are, respectively, represented as:<sup>86,87</sup>

$$S(t) = \frac{\langle h(0)H(t)\rangle}{\langle h(0)h(0)\rangle} \tag{1}$$

$$C(t) = \frac{\langle h(0)h(t)\rangle}{\langle h(0)h(0)\rangle}$$
(2)

The function h(t) may assume a value of zero or one, where all hydrogen bonds present at t = 0 are defined with a value of one. This value of unity is established at an instant that the same hydrogen bond exists and is zero otherwise; thus, the bond may break and reform. H(t) in eq 1 retains a value of unity until the bond is broken, after which point it takes on a value of zero. Equation 1 then defines the continuous hydrogen bond lifetime (cHBL), while eq 2 defines the intermittent hydrogen bond lifetime (iHBL). These two quantities give rise to different interpretations, where the cHBL indicates the absolute stability of the bond, while the iHBL involves this stability in conjunction with diffusive properties, thus representing the true length of a particular interaction. The decay curves resulting from this process were fit to two exponentials for both cHBLs and iHBLs, as the use of multiple exponentials has been needed to adequately capture the decay curve.<sup>60,64</sup> Coupling between diffusion and hydrogen bond formation is at play in the static hydration layer, thought to be the microscopic reason behind the multiple relaxation modes.<sup>60</sup> The prefactors of these exponentials then sum to one, so we have reported the overall characteristic time as a weighted average of the two relaxation times as is appropriate. The hydrogen bond of water is defined to have a donor-acceptor distance less than 3.5 Å with an angle between the vector created with the donor and hydrogen, and the hydrogen and acceptor restricted to an angle of 55°. This choice in the angle is larger than what is traditionally used; the details of this choice are elaborated on in Section S7 of the Supporting Information.

Section 3.3 shows the residence time of water and ions, radial distance from the backbone, using the survival probability function in MDAnalysis. This option defines the residence time as:

$$P(\tau) = \left\langle \frac{N(t, t+\tau)}{N(t)} \right\rangle_t$$
(3)

where  $\tau$  is the time window and  $N(t,t + \tau)$  is the number of particles present in a group from timestep t through timestep t+  $\tau_{i}$  and this correlation is then averaged over the different starting points. This function allows a geometry-based selection criteria, where we chose radial distances from the backbone, e.g., from 4 to 6 Å.

#### 3. RESULTS AND DISCUSSION

3.1. Distribution of Ionic Functional Groups and Monatomic lons. To create an understanding of the ion landscape around the polymer, we obtained the distribution of key ionic pendant functional groups and monatomic ion distributions when relevant. First, we computed the distribution of normal distances between the polymer backbone and either the nitrogen atoms in ammonium or oxygen atoms in sulfonate. Figure 2 shows that the ammonium group distribution is much narrower than that of sulfonate and neither are Gaussian distributions. To quantitatively discuss their ranges, the bounding inflection points for the major features of the distribution in pure water at 10 °C were taken, as there is little variance in the range under the various system conditions. Thus, the ammonium group ranges from 5.3 to 6.3 Å (Figure 2a) and sulfonate groups range from 3.6 to 10.5 Å away from the backbone (Figure 2b). We will define this latter maximum bound as  $\xi_{\rm P} = 10.5$  Å or the bound of major pendant extension, which will become relevant in Section 3.2. It is apparent that the sulfonate group samples a broad radial region (see also Section 3.4), interacting with both the amide group and ammonium groups represented by the first and second peaks, respectively. These interactions were confirmed with the radial distribution functions between sulfonate and ammonium and are shown in Figure S1. Although these ranges do not significantly change with either temperature or the addition of salt, the distribution of  $O_{Sulfonate}$  sampling shifts. An assessment of the radius of gyration  $(R_g)$  for the polymer is included in Section S5 where we illustrate that the  $R_g$  for this short chain polybetaine does not exhibit a statistically significant difference under any system conditions. This substantiates our assertion that this short 30 repeat unit chain serves to isolate the hydration effects of the polymer from the known stimuli

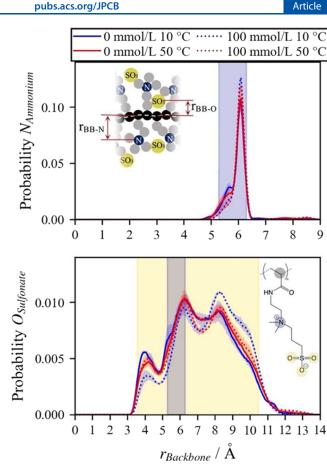
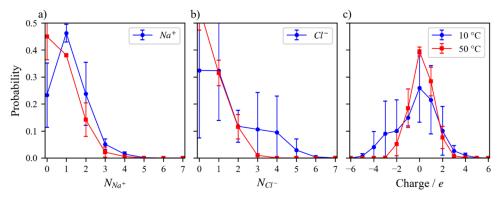


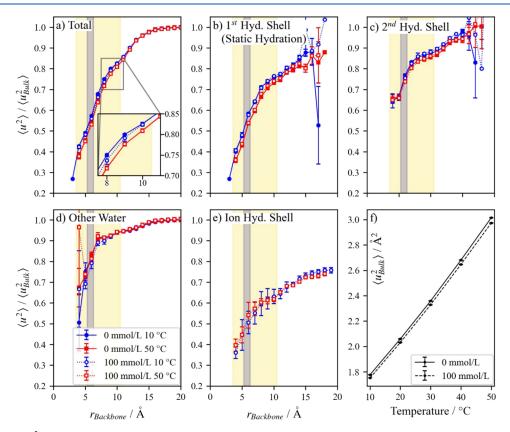
Figure 2. Distribution of ionic functional group atoms normal to the backbone. (a) Nitrogen in quaternary ammonium,  $N_{Ammonium}$ , with a schematic of the pendant group. (b) Oxygen in sulfonate, O<sub>Sulfonate</sub>, with respect to their respective backbone atoms. Regions highlighted in yellow (larger area) and blue (central area) represent the ranges that sulfonate and ammonium traverse, respectively. Shaded regions represent the standard deviation over the three independent boxes.

response of chain dimensions to temperature and 100 mmol/L NaCl.

In previous simulation studies involving the same ionic functional groups but with a methacrylamide backbone and a slightly longer pendant, it was found that as the salt concentration increased, the cloud point increased to a maximum before declining.<sup>88</sup> However, this same increase in ion concentration with a methacrylate backbone resulted in a monotonic decrease in the cloud point for phase separation. The nonmonotonic behavior for the methacrylamide correlated with the surface charge measured by the zeta potential of the polymer, which is positive in pure water and decreased to zero for the maximum cloud point concentration before the polymer gained and subsequently increased in negative charge. Because the methacrylate containing polymer exhibited a negative surface charge for all salt concentrations, these trends were taken to be correlated. Although a rationale involving Clpenetration was stated in that work for the decrease in positive charge,<sup>88</sup> the reason for a positive charge in pure water as a starting place was perplexing and still unexplained. We expect from our results that the propensity for sulfonate to interact with an amide backbone group in conjunction with the longer pendant group of that study might be the cause of a positive surface charge, as this interaction would result in exposed ammonium groups. An increase in the cloud point observed



**Figure 3.** Probability distribution of monatomic ions and net charge at a particular moment in time within  $\xi_{\rm P} = 10.5$  Å of the PAEDAPS backbone at the lowest and highest temperatures, 10 and 50 °C. The range in the x-axes represent the full range of the distributions. Uncertainty intervals represent the standard deviation over three independent simulation boxes, which reflect differences in polymer configuration shown in Section S5, which were not shown to significantly change at 10 °C in Figure S2.



**Figure 4.** (a) Relative  $\langle u^2 \rangle$  for all water at a radial distance from the backbone with varying change in stimuli. The mobility relative to the bulk of (b) first hydration shell (see Figure 1b for visualization), (c) second hydration shell (within the second minimum of the partial pair distribution function for hydrophilic moieties), and (d) water that is not within two shells of hydration are shown. (e) To clarify the role of NaCl, the relative mobility of water in its first hydration layer was further separated. Although the change in  $\langle u^2 \rangle$  as a function  $r_{\text{Backbone}}$  appears small in (a) because of the *y*-axis scale, (f) shows that there is an appreciable change in the  $\langle u^2 \rangle$  for the bulk solution with respect to temperature. Regions highlighted in yellow (larger area) and blue (central area) represent the ranges that sulfonate and ammonium samples traverse, respectively. Uncertainty intervals represent the standard deviation over three independent simulation boxes, where large uncertainties indicate a region with poor sampling of solvent molecules throughout the 5 ns trajectory or may be smaller than data markers.

with the small addition of salt<sup>88</sup> would then plausibly result from the replacement of self-pendant interactions with interactions among other parts of the same chain or from the collective effect of surrounding chains. Similar reasoning for the influence of salt has been proposed in other experimental studies.<sup>89–91</sup> Considering the change in the backbone and the increased length of the pendant, a study of

this specific polymer and a more thorough analysis of relative binding energies is required for a firm stance to be established.

To better interpret these results, it is important to understand the distribution of monatomic ions interacting with the polymer pendant groups. We took an average of the charge due to monatomic ions at a cutoff value of  $\xi_{\rm p}$  from the PAEDAPS backbone to approximate the upper bound of extension exhibited by the pendant groups as shown in Figure 2. At 10 °C, the polymer contains a charge and standard deviation of  $(-0.3 \pm 1.3)$  *e* where on average there are  $(1.2 \pm 1.3)$ 0.3) Na<sup>+</sup> ions and  $(1.4 \pm 1.1)$  Cl<sup>-</sup> ions. At 50 °C, these charges skew more positive at  $(0.2 \pm 0.3)$  e with the number of ions shifting to  $(0.8 \pm 0.2)$  Na<sup>+</sup> and  $(0.6 \pm 0.1)$  Cl<sup>-</sup>. Such statistics suggest few direct interactions between ions within  $\xi_{\rm P}$  from the backbone and very little influence in surface charge with a similar average number of each ion. Notice, Figure 3 depicts the probability distribution for a given number of ions, where a box of our size at 100 mmol/L NaCl contains 42 ion pairs. Figure 3c illustrates the charge average and captures the variation from -6 e up to 6 e. The averages reported in this work are dependent on our chosen forcefield; regardless, it is apparent that there are fluctuations in polymer charge throughout the simulations, especially with fluctuations in Cl<sup>-</sup> ions at 10 °C.

3.2. Quantifying Dynamic Hydration with Radial Mobility Gradients via  $\langle u^2 \rangle$ . We first recall previous works aimed at quantifying the dynamic hydration layer and the influence of this layer on the solution properties of proteins.<sup>40,43-45,92</sup> One such example used the vibrational density of states (VDOS) of water around a protein to identify three types of water states: bound, weakly associated, and unassociated or "free" water.<sup>51</sup> The largest differentiating feature between these categories was the VDOS frequency range below 50 cm<sup>-1</sup>, corresponding to diffusion on the picosecond timescale and thus also to our chosen metric,  $\langle u^2 \rangle$ . Furthermore, each of these states of water were found adjacent to even the most hydrophilic or hydrophobic of groups, despite a naive expectation of clean separation of these proposed dynamical states. Thus, we elect to take an averaging approach to compare the various system conditions of this work. We then compute  $\langle u^2 \rangle$ , the mean squared displacement at 1 ps, radially outward from the polymer backbone in isolayers that change shape according to the flexibility of the backbone, and the result of which is shown in Figure 4. These averages include a convolution of effects that arise from the polymer pendant groups. Our approach provides a means of discerning the extended dynamic hydration layer, while avoiding configurational complications. However, we deconvolute our results between the various types of interfacial solvent such as those within the static hydration layer (first shell, Figure 4b), the second shell hydration layer (Figure 4c), and those that are not in either (Figure 4d, visualizations can be found in Figure 1). For 100 mmol/L solutions, the first hydration shells of monatomic ions are removed from the other categories as seen in Figure 4e. Here, we show the results for the extremes of our temperature range, 10 and 50 °C for clarity. The mobility profiles at other temperatures can be found in Section S6 of the Supporting Information.

Not surprisingly, the mobility of the bulk solvent varies dramatically with temperature. Figure 4f depicts the expected increase in solvent mobility as temperature increases, as well as the drop in mobility with the inclusion of 100 mmol/L NaCl, which is known to increase the viscosity<sup>93</sup> of water. It is apparent from Figure 4a–d that proximity to the polymer backbone adds an additional effect on the solvent mobility. To compare these gradients for various system conditions, the data were scaled by their respective bulk solvent mobility values.

With this scaled perspective, it is apparent that close to the backbone the solvent mobility is 40% of the bulk value, and the scaled mobility,  $\langle u^2 \rangle / \langle u^2_{\text{Bulk}} \rangle$ , is between 0.83 and 0.85 at the extent of where sulfonate groups sample,  $\xi_{\rm P} = 10.5$  Å. The

mobility of solvent returns to the bulk solvent mobility when 18 Å from the backbone, which is consistent with the definition of the mobile interfacial layer in ice<sup>94</sup> and crystalline Ni.<sup>95</sup> Thus, the  $\langle u^2 \rangle$  of water is generally suppressed near the polymer surface under the thermodynamic conditions that we study. A similar change in mobility relative to backbone proximity is observed in the static hydration layer. Notice the high relative mobility for water next to the exposed sulfonate groups, especially when compared to solvent that lies closer to the backbone. This observation accords with the conclusions of a simulation study of the hydration layer around DNA,<sup>66</sup> where the static hydration layer was found to be less stable for charged phosphate groups than polar groups shielded within DNA grooves. This destabilization of the hydration layer around charged groups was inferred to be due to its position exposed to the bulk solvent. The relative mobility of the second shell is higher (Figure 4c), ranging from 0.65 of the bulk value at 4 Å to approaching the bulk value at its greatest extent. Both the first and second hydration layers (Figure 4b,c) can extend out to 16 Å from the backbone at 50 °C and 15 Å at 10 °C, which is significantly farther than  $\xi_{\rm P}$  = 10.5 Å (Section 3.1), and thus represents the tail of the O<sub>Sulfonate</sub> distribution shown in Figure 2b. However, the integrity of our chosen length scale is substantiated in Figure S7, where the fraction of each type of water depicted in Figure 4 demonstrates that the fraction of water within the static hydration layer dramatically drops below 10% beyond approximately 11 Å from the backbone, illustrating the low impact of the static hydration layer of the few sulfonate groups beyond the length scale,  $\xi_{\rm P}$ . The suppressed mobility extending beyond the second hydration layer (Figure 4d), and to such a distance from the polymer (18 Å), illustrates polybetaine's effect on the surrounding solvent, even for this short chain. It is apparent from these profiles that the polymer affects the dynamics of water on a length scale that is larger than the static hydration layer (3 Å). For this work, we take the dynamic length scale,  $\xi_D$ , to be the farthest extent, 18 Å, less the extent of the pendant groups ( $\xi_{\rm P}$ =10.5 Å), leaving a dynamic length scale,  $\xi_{\rm D} = 7.5$  Å.

When we more closely examine the effect of temperature changes and salt content on relative mobility profiles, unexpected trends emerge. First, the addition of 100 mmol/ L NaCl and an increase in temperature both decreases the relative mobility. This change suggests that an increase in entropic disparity between dynamically altered water within the polymer and the bulk solvent accompanies an increase in temperature and the addition of salt. Such a temperature dependent trend is an aspect of the *hydrophobic effect*, <sup>96,97</sup> as it pertains to entropy-enthalpy compensation, as the dynamic hydration layer is expected to contribute toward the entropy of solvation as discussed in the introduction. However, a decrease in the relative mobility may also be interpreted as an increase in stiffness,<sup>98</sup> which is known to occur with the addition of salt.<sup>99</sup> Our choice to simulate relatively short chains to avoid excluded volume effects in our polymers precludes quantitative investigation of changes in the polymer dimensions due to salt or temperature. Further study should be made of whether the relative water mobility is reduced near the polymer backbone for other polybetaines, as both increases and decreases in mobility have been observed in coarse-grained simulations of the solvent mobility gradient around ions<sup>100</sup> and in the polymer matrix around nanoparticles,<sup>56</sup> depending on the

interaction of the surrounding fluid for the ions or nanoparticles, respectively.

**3.3. Radial Dependence of Water Molecule Residence Time.** With an understanding of the altered mobility experienced by the solvent surrounding PAEDAPS, we must assess the persistence time of solvent in this hindered state to conclude that this region can contribute to the apparent hydrodynamic size. To assess our dynamic hydration layer at an atomic resolution, we characterize the entrainment of water surrounding the polymer. We defined radial zones as isolayers with a distance constraint from the polymer backbone, allowing the shape of the zone to change accordingly, and computed the continuous residence time in each zone. Figure 5 shows the continuous residence times of water and

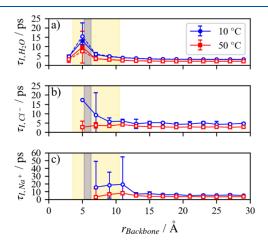


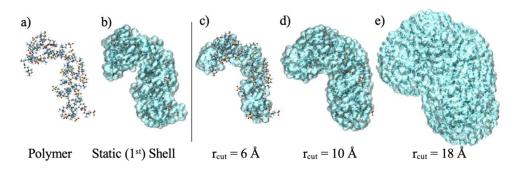
Figure 5. Continuous residence time of (a) water (where pure water is represented with solid lines and markers while 100 mmol/L with dashed lines and hollow markers), (b) chlorine ions, and (c) sodium in 2 Å radial zones relative to the polybetaine backbone. Regions highlighted in yellow (larger area) and blue (smaller area) represent the range that sulfonate and ammonium traverse, respectively. Regions with missing data resulted from a lack of sampling. Uncertainty intervals may be smaller than data markers.

monatomic ions in these zones of 2 Å thickness, which represent the characteristic times for a molecule to leave a given region. The decay curve was determined using a trajectory written out every picosecond and fit to two exponential decay functions. The data represent the center of each zone; thus, the sparce population of ionic functional groups close to the backbone (Section 3.1) suggests that sodium and chlorine do not spend a significant amount of time less than 5 Å from the backbone (Figure 5b,c).

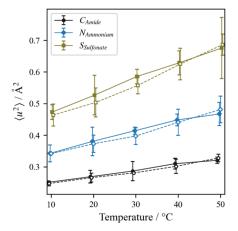
In previous studies of the first shell hydration layer (static layer) of proteins, a continuous residence time above 10 ps was considered the threshold that defined strongly bound water.<sup>59</sup> Only water molecules at 10 °C reaches this threshold residence time. However, the precedent in defining a residence time for loosely associating water molecules in comparison to bulk water does not exist. The residence time drops beyond the reach of ionic functional groups to within 5% of the bulk water value after 16 Å at 10 °C and 14 Å at 50 °C (Figure 5a). This length scale suggests the entrainment of water beyond the reach of sulfonate groups (10.5 Å defined in Section 3.1), approximately represented in Figure 6d. If one set an absolute cutoff requiring a characteristic time for water of at least 5 ps, this would occur 8 Å from the backbone at 10 °C and 6 Å at 50 °C (Figure 6c). These length scales are then visually compared to the hydration shell within 18 Å, as obtained in Section 3.2, where the mobility of water returns to bulk values (Figure 6e).

Overall, the residence time of Na<sup>+</sup>, 5 Å from the backbone is more than 50% higher than Cl<sup>-</sup> or water at 10 °C. This corresponds to the higher diffusion coefficient of chlorine in water compared to sodium.<sup>101</sup> While Cl<sup>-</sup> exhibits its longest continuous residence time in the ammonium region at 10 °C (as expected), this interaction is lessened at 50 °C. Notably, there is no increased sampling close to the backbone at higher temperature as proposed in the study of a methacrylamide containing polybetaine's salt dependence on the cloud point<sup>88</sup> (see Section 3.1).

**3.4.** Mobility of Betaine Moieties. Much of the simulation-based literature suggests that stiffer polymer groups lead to reduced stability of the solvent layer.<sup>44,50,60</sup> We expect that a change in strength of pendant interactions will result in an inverse change of polybetaine mobility. For example, if salt has a screening effect disrupting pendant group interactions, the mobility of the pendants should increase. However, if salt is interacting with the pendants or if the density/viscosity of the system increases, a decrease in solvent mobility should be observed. To investigate these hypotheses, we calculated  $\langle u^2 \rangle$  for each of the central functional groups of PAEDAPS, namely, the carbonyl carbon of the amide group, the nitrogen of ammonium, and the sulfur of sulfonate. Figure 7 shows that the



**Figure 6.** Polybetaine with variations in hydration represented as the isosurface. The first two structures represent: (a) bare polymer and (b) polymer with its static hydration shell determined from water with some cutoff distance from each hydrophilic atomic species. The following structures (c–e) indicate what the dynamic hydration layer would look like at various cutoff values from the backbone. The longest extension of sulfonate groups in the pendants is  $\xi_p = 10.5$  Å (Section 3.1). The mobility of water, quantified in Section 3.2, returns to the bulk value at 18 Å. These isosurface representations were generated with the package, Visual Molecular Dynamics (VMD)<sup>92</sup> with a density cutoff of 0.1 atoms/Å<sup>3</sup> to illustrate an encasing zone.

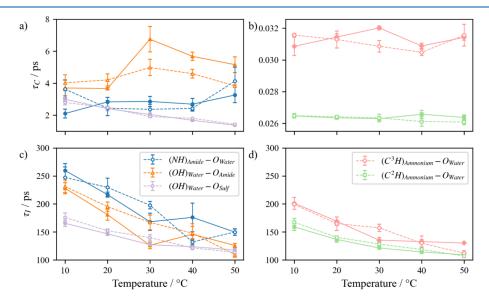


**Figure 7.** Mobility of betaine functional groups represented from key atoms: the carbonyl carbon in the amide group, nitrogen in ammonium, and sulfur in sulfonate. The mobilities of these atoms are compared between solution conditions of pure water (solid line and markers) and 100 mmol/L NaCl (dashed line and hollow markers). Uncertainty intervals represent the 95% confidence intervals over three independent simulation boxes.

mobility of the functional groups increases with respect to temperature and decreases as their relative degree of separation from the backbone decreases, with no change in the presence of 100 mmol/L NaCl. This relationship between functional group mobility and degree of separation from the backbone and the effect of temperature corresponds to the changes observed in bulk water mobility (Figure 4f). This suggests that at this salt concentration, polymer–salt interactions do not play a large enough role in stiffening the pendant group, while Section 3.2 shows an increase in relative stiffness of the solvent when compared to the bulk. The effect of temperature can be understood from the perspective of a simulation study where an infinitely stiff protein dampened the surrounding solvent's mobility, as their interactions were longer lived, in comparison to the standard flexible model.<sup>50</sup>

3.5. Hydrogen Bond Lifetime Analysis. Simulationbased studies have yielded substantial insight into the static hydration layer, which was the focus of most simulation-based studies of hydration.<sup>27,44,60-66</sup> Thus, we must assess the hydration layer with traditional means to compare our new understanding of how mobility gradients elucidate the dynamic hydration layer's response to temperature and salt. We chose the popular HBL analysis method to study the static hydration layer of PAEDAPS, which represents the first hydration shell of water that is adjacent to hydrophilic polymer functional groups. Figure 8 illustrates the change in characteristic times for both cHBLs and iHBLs (Section 2.2) concerning temperature variation under two conditions: pure water and 100 mmol/L NaCl. A hydrogen bond is defined to have a donor-acceptor distance that is less than 3.5 Å with an angle between the vector created with the donor and hydrogen and the hydrogen and acceptor restricted to an angle of 55°. This choice in angle is larger than what is traditionally used; the details of this choice are elaborated on in Section S7 of the Supporting Information. As shown in Figure 8, the hydrogen bond donor and hydrogen atom are labeled first in parenthesis and the acceptor is listed second. Notice that we have included hydrogen bonds from hydrogen atoms with a second-degree connection to ammonium, which are suspected of having weak hydrogen bonding ability.<sup>102,103</sup>

As one might expect, the ammonium cHBLs with water are significantly shorter lived than hydrogen bonds between the solvent with other hydrophilic polymer moieties, although the difference between ammonium—water cHBLs and the cHBLs with other polymeric groups differ by two orders of magnitude. In Section S7, we discussed that these results are heavily impacted by the choice in geometric constraints. Here, we differentiate between the sp<sup>2</sup> and sp<sup>3</sup> ammonium methylene groups, showing that sp<sup>2</sup> groups in the pendant's backbone show lower cHBLs compared to the sp<sup>3</sup> methyl groups (Figure 8b). The cHBL of water with the sulfonate group at the end of the pendant group (Figure 8a) is more comparable in orders of magnitude with the HBL expected between water molecules,



**Figure 8.** HBLs between polybetaine, PAEDAPS, and water. The top row represents the continuous lifetime with the characteristic timescale before breaking the bond. The second row represents the intermittent lifetime where the interaction may break and reform until that interaction no longer occurs due to diffusion. The solid lines (--) indicate characteristic times in pure water, while the dashed lines (--) indicate 100 mmol/L NaCl is present. Uncertainty intervals represent standard deviations from three independent simulation trajectories and may be smaller than data symbols.

i.e.,  $\approx 1.3$  ps,<sup>61,62</sup> and is comparable to the hydration of the anionic surfactant sodium bis(2-ethyl-1-hexyl) sulfosuccinate (AOT) where the cHBL was found to be 1.5, and 19.9 ps for the iHBL at 25 °C.64 In a study comparing the hydration dynamics of glycine's dimethyl- and trimethylated analogues, the cHBLs were found to be sensitive to clustering.<sup>27</sup> It was suggested that although water remains adjacent to trimethyl glycine in a condensed scenario, the solvent readily transitions to bonding with another closely available hydrogen atom. This effect has also been shown in simulations of phosphate lipid bilayers where HBLs were compared between a pure water solvent and a mixed water/ethanol solution.<sup>65</sup> The cHBL between water and phosphate groups decreased from 2.8 to 2.2 ps with the introduction of ethanol, and the iHBL decreased from 81 to 59 ps. We expect that this behavior may cause the low cHBLs of ammonium, and indeed when reformation is allowed, as in iHBLs, the dramatic difference between ammonium and the other hydrogen bonding groups disappears (Figure 8c,d). A combination of strong hydrogen bonding species with hindered diffusion may be at play with the formation of bridged structures bonded to multiple species simultaneously, as can be the case with protein helices.<sup>1</sup>

Because our iHBLs are an order of magnitude higher than reported in other works, we expect diffusion limitations and changes in stiffness for the polymer environment to be at play within the brushy pendant groups of PAEDAPS. In a study of water dynamics around peptides, the iHBLs of the static hydration layer were in the range of 25-50 ps for uncharged moieties,<sup>60,63</sup> although this study differs to our study in the water model (TIP3P) considered and sets stricter geometric constraints (a cutoff distance of 3.3 Å and an angle of 35°). Notably, these simulations involved only two alpha helices in solution<sup>60</sup> and even that relatively unrestricted solvent environment, with relatively stiff peptide segments, resulted in higher water residence times. A study on the hydration of apomyoglobin with femtosecond fluorescence in conjunction with MD also indicated that a decrease in structural flexibility would increase the relaxation time.<sup>44</sup> Given that our iHBLs are an order of magnitude higher that these other works, we expect that the environment within betaine pendant groups suffers from the same encumbrance. Especially given that the iHBLs of the amide backbone are greater than those between water and the charged functional groups. Just as in a study of DNA, static hydration indicated that the HBLs between phosphate and water were lower than for nonionic groups in the major and minor grooves of duplex DNA, an effect interpreted as being due to the prevalent solvent exposure for the DNA phosphate groups.<sup>66</sup>

It is apparent that there is a consistent impact of temperature on the characteristic timescales associated with the static hydration layer and an increase in the HBL with the influence of salt under most conditions. With higher residence times when 100 mmol/L NaCl (dashed line) is included for iHBLs between water and both sulfonate and ammonium methyl groups at lower temperatures, we determine that the static hydration layer becomes more stable. If the ions are spending a significant amount of time among the pendant groups (Section 3.4), this may indicate the hydrogen bond bridge scenario, although there is on average a single monatomic ion of each type (Section 3.1). Such a stable hydration layer corresponds to our expectation of good solvent that interrupts pendant pendant interactions. An increase in temperature reduces the lifetime, as thermal energy overcomes this interaction leading to a more flexible polymer as expected.

# 4. CONCLUSIONS

Polybetaine materials are known to exhibit changes in mechanical and structural properties in response to stimuli such as temperature and salt type/concentration. In this work, we applied AA-MD to study a 30 repeat unit, atactic chain of PAEDAPS with and without 100 mmol/L NaCl from 10 to 50 °C in increments of 10 °C. Here, we studied the static and dynamic hydration layers with traditional and emerging analyses. Then, to gain a better perspective of the charged landscape that heavily influences these changes, the distributions of ionic functional groups and monatomic ions provided insight.

The average location of ions in PAEDAPS were established with the distribution of ionic polymer functional groups and monatomic ions relative to the backbone (Section 3.1). The radial range of the ionic functional groups with respect to the backbone did not change with increased temperature or the introduction of salt and the  $R_{\sigma}$  did not change in a statistically meaningful way with changes in thermodynamic conditions (Section S5), suggesting that our choice to simulate relatively short chains to avoid excluded volume effects was successful. However, the variation in chain dimensions for individual boxes (Figure S6) suggests that strong ionic functional group interactions would require sampling at a significantly longer timescale than the 5 ns used in this work. Nonetheless, the distribution of sulfonate oxygen atoms relative to the backbone provided a limit of 10.5 Å for reasonable pendant extension. The lower bound of sulfonate sampling at 3.6 Å illustrates that a fraction of the sulfonate groups are buried among the pendants rather than outward facing. Such pendant configurations may explain the positive zeta potential observed in a related polybetaine with a methacrylamide backbone (discussed in Section 3.1). Although the origin of the positive charge in pure water was left unknown, this work supposed that chlorine may be interacting with the amide backbone groups to decrease the positive charge, which was not supported by our assessment of ion residence times in Section 3.3 or probability densities of ions within the polymer pendants in Section 3.1, as the average number of both Na<sup>+</sup> and Cl<sup>-</sup> is approximately one ion within the bound of pendant extension,  $\xi_{\rm P} = 10.5$  Å (Section 3.1).

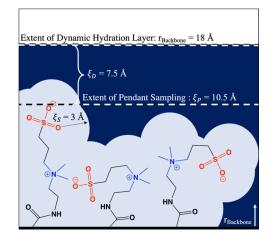
We assessed the response of the static hydration layer to stimuli with a traditional HBL analysis of solvent/polymer interactions. The static hydration layer becomes less stable with increasing temperature, as evidenced by lower intermittent HBLs (Section 3.5). There was a slight increase in HBLs with the inclusion of salt. There is a well-established relationship where a stiffer polymer results in increased HBLs; however, the relative mobility of the polymer functional groups did not change with the inclusion of 100 mmol/L NaCl (Section 3.4). Nonetheless, our continuous HBLs are an order of magnitude higher than those listed in the literature for nonionic functional groups. Thus, the stronger static hydration layer expected of polybetaines is present to create a protective barrier essential for antifouling applications; however, this feature is thought to be derived from vicinal hydrating water rather than the static hydration layer, which is defined to be within approximately  $\xi_s = 3$  Å of hydrogen bonding moieties.

In our study of the static hydration layer around ammonium, the cHBLs were extraordinarily short, while the intermittent The Journal of Physical Chemistry B

lifetime was comparable to other functional groups. Other studies have suggested that multiple hydrogen bond acceptors in close proximity can lead to such decreases in the cHBL, while not necessarily representing an increase in diffusion from the site. Our continuous residence time calculations support this where in the region around ammonium groups, the solvent experiences a maximum in the residence time that is well above the cHBL for ammonium, substantiating that the competing presence of positive hydrogen atoms in ammonium serve to decrease the cHBL without representing a decreased interaction time between water and ammonium.

Extended hydration layers have previously been studied with simulation methods for a variety of charged biomacromolecules; however, the methods used in the literature to date that can discern the dynamic hydration layer are computationally intensive. We show an efficient way to quantify the dynamic hydration layer via simulation through a mobility metric,  $\langle u^2 \rangle$ , defined as the mean-square displacement at a timescale on the order of 1 ps. Notably,  $\langle u^2 \rangle$  at a characteristic time on the order of the fast  $\beta$ -relaxation of water<sup>105</sup> has been related to the  $\alpha$ -relation time for water and many other complex fluids and so serves a simple means of quantifying mobility in relation to the rate of structural relaxation and diffusion. The presence of a larger dynamic hydration layer when compared to the hydration captured by static properties has been previously established.<sup>106</sup> Conclusions drawn from changes in absolute solvent mobility align with those drawn from HBL analysis with respect to changes in temperature and the inclusion of salt. While the introduction of 100 mmol/L NaCl does not significantly change the mobility (i.e., stiffness) of the polymer functional groups (Figure 7), it does reduce the bulk solvent mobility (Figure 4e) as well as the relative mobility within the pendant groups (Figure 4a). Regardless of these stimuli, a gradient of hindered mobility was quantified with  $\langle u^2 \rangle$  to extend to 18 Å from the backbone, thus capturing a property of PAEDAPS that is not apparent using static metrics like the number density or the tetrahedral order parameter (Section S9). Indeed, with the limit of major pendant sampling at  $\xi_{\rm P}$  = 10.5 Å, there is  $\xi_{\rm D}$  = 7.5 Å representing purely dynamically altered water, as less than 10% of this region represents the static hydration layer after 11 Å from the PAEDAPS backbone (Figure S7). The basic findings of the present work are schematically visualized in Figure 9 to emphasize our main points. This work views the hydration layer as a region taken from the polymer backbone rather than in terms of hydration layers. Figure 4 illustrates mobility gradient within hydration layer definitions as well as "entrained" water among the brushy pendant groups beyond the first and second hydration layers that converge to bulk mobility values at a characteristic length from the backbone,  $\xi_{\rm D}$ .

In the process of illustrating our new method of analyzing the dynamic hydration layer with the Debye–Waller parameter, this work has revealed several atomistic level insights into polybetaine systems, including our observation of nonergodic behavior on the nanosecond timescale. While our simulation strategy has provided a demonstration of this insight, future works of this nature that compare the dynamic hydration of varying chemistries, might consider creating a simulation box with cylindrical symmetry where the polymer is infinitely long through its periodic image.<sup>107</sup>



**Figure 9.** Depiction of hydration layer contributions from the backbone at the bottom, extending through configurations of pendant groups  $(\xi_p)$ , continuing through dynamically altered water  $(\xi_D)$ , to the bulk solvent at 18 Å. The impact of the simplified depiction in this figure is more accurately represented with a flexible backbone in Figure 1. This figure is not to scale.

# ASSOCIATED CONTENT

# **Supporting Information**

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acs.jpcb.3c03654.

The sequence of enantiomers for each box, radial distribution functions for pendant interactions, and a comparison of dynamic hydration profiles at 10 °C to substantiate production run times; a visualization of nested isolayers is included for clarity in understanding isosurface calculations; we show evidence that the  $R_{\sigma}$  for our 30 unit PAEDAPS chain illustrates a lack of statistically significant change with respect to stimuli, although the distributions leading to these values provides more insight; the additional mobility profiles of other temperatures are provided for a fuller picture; heat maps of the geometric distributions used in hydrogen bond analysis supplement a discussion on our generous constraints for hydrogen bond analysis followed by the first and second minima of the paircorrelation functions between the hydrophilic polymer atoms and water; and the radial number density and tetrahedral order parameter distributions close to and far from the backbone for water illustrate that capturing the extent of the dynamic hydration layer is limited to the mobility metric used in this work and cannot be replicated with static quantities (PDF)

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#### Notes

The authors declare no competing financial interest.

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