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Ion association in aqueous solution

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### ABSTRACT

The properties of aqueous ionic solutions are determined by strong electrostatic interactions, which are influenced by polarizability and charge transfer interactions. Potential models which include polarizability and charge transfer have been developed for water and single ion properties. Here, the ion–ion interactions are optimized so that the osmotic pressure as a function of concentration is reproduced. Using the optimized potentials, the amount of ion pairing and larger cluster formation is calculated. For NaCl, NaI, and KCl, there is a small amount of pairing, with larger clusters present as well. For KI, there is much more pairing and much larger clusters are observed. The amount of pairing is consistent with the law of matching affinities, with the pairs that show the least pairing also being the most mis-matched in terms of size or solvation free energy. The charge transfered from the anions to water is more than from is transferred from the water to cations, so the water molecules acquire a negative charge, which increases with ion concentration.

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### 1. Introduction

The aqueous hydration of ions involves a balance of ion-ion, ion-water interactions, and water-water interactions, in order of decreasing strength. For example, the interaction energy between a sodium and a chloride ion is -132 kcal/mol [1], the water-chloride interaction energy is -13.6 kcal/mol [2] and the water-water interaction energy is -5.0 kcal/mol [3]. This balance of large energies is indicated by the large lattice energy of salts (188 kcal/mol for NaCl) and the large solvation enthalpy (-187 kcal/mol for NaCl) adding up to give a relatively small heat of solution of about 1 kcal/mol [4]. The interplay of these interactions can determine if a salt is insoluable, completely dissociated in solution, or some intermediate point involving ion pairing. Experimental evidence for ion pairing for univalent ions below supersaturation comes from a variety of sources. Ion pairing is indicated in a variety of other approaches, including conductometry [5], potentiometry [6], ultrasonic relaxation [7], near edge X-ray absorption spectrocopy [8], dielectric relaxation spectroscopy [9], and near infrared spectroscopy [10], (see Ref. [11]), and molecular dynamics simulations [12–23]. The most direct structural indication of pairing would come from neutron diffraction or X-ray scattering but the ion-ion signal in both approaches is small relative to the signal from water-water and

http://dx.doi.org/10.1016/j.fluid.2015.05.001 0378-3812/© 2015 Elsevier B.V. All rights reserved. water-ion correlations, and so these approaches rely on molecular dynamics simulations to determine the amount of ion pairing [24,25]. Clusters larger than pairs are found for solutions under ambient conditions at unsaturated concentrations from Raman [26] and vibrational energy transfer [27] experiments as well as molecular dynamics simulations [28–32]. The simulations revealed that alkali halide salts can form clusters of up to about five ions and while neutral aggregates are most probable, charged clusters are also found, with a preference for excess cations [30,32]. The smaller cations tend to cluster more than larger cations [30]. Experiments on alkali-thiocyanate salts reveal a different picture. The charged clusters in those solutions tend to have an excess of anions and the bigger cations tend to cluster more, suggesting that cluster formation might be driven by the matching of cation and anion types [27].

Osmotic pressure can indicate the degree of ion pairing [11]. In a concentrated solution, water–water interaction and interactions between unlike ions tend to promote phase separation into a very concentrated solution and pure water, whereas ion–water and like–ion interactions favor a single dilute solution. If ions in a concentrated solution are restrained by a semi-permeable membrane, the pressure exerted by the solution may be less than expected for an ideal solution of fully dissolved salt. Reproduction of the osmotic pressure for salt solutions has been used to parameterize potential models for ion interactions [17,21,23,33,34]. Other related methods use the activity coefficient for ion-pair potential refinement [35–37]. These efforts show that changing only the unlike ion interaction, thereby changing the amount of ion pairing, and leaving all







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other interactions unchanged has a strong effect on the osmotic pressure [21,23,34]. This method is effective because small changes in the energy can shift the balance between the contact ion pair and the fully dissociated ions. Ion pairing is believed to be largely driven by the strength of the water-ion interaction, as given by the law of matching water affinities [38]. The osmotic coefficient shows a correlation with the difference in the absolute free energy of solution between the anion and the cation (Fig. 1, data from Refs. [39–41]). This shows a similar volcano relationship (or in this case an inverted volcano) to other thermodynamic properties [38]. The salts that have the smallest osmotic coefficient are those with the closest free energies of solution. This includes large anion-large cation pairs like CsI (which has the lowest osmotic coefficient among the salts in Fig. 1) and small anion-small cation pairs like NaF. Both small anion-large cation (on the left of Fig. 1) and large anion-small cation (on the right) have larger osmotic pressures.

In this paper, we use recently developed models which include charge transfer and polarizability [42–44] to examine the formation of ion pairs and larger clusters. Models for Cl<sup>-</sup>, I<sup>-</sup>, Na<sup>+</sup>, and K<sup>+</sup> have been developed which reproduce the single ion free energies of solution as well as other structural, energetic, and dynamical properties [43,44]. We will adjust the interactions between unlike ion pairs to reproduce the osmotic coefficient as a function of concentration as has been done in previous studies [21,23,34]. The optimized potentials will be used for the clustering analysis of the four salt solutions, NaCl, NaI, KCl, and KI.

#### 2. Methods

The osmotic pressure calculations. The osmotic pressure was calculated using the method of Luo and Roux [21] in which an artificial semi-permeable membrane is set up, which is permeable to water but not to ions. This method has the virtues of being exact, and so applicable to solutions of any concentration, and easy to implement. This is done by simply setting up a half-harmonic restraint which only acts on the z component of the ions according to

$$E_{restraint} = \begin{cases} 0 & z < z_r \\ \frac{1}{2}k_r(z - z_r)^2 & z \ge z_r \end{cases}$$
(1)

where  $k_r$  is the force constant (set equal to 10 kcal/mol/Å<sup>2</sup>) and  $z_r$  is the position of the restraining membrane (set equal to 22 Å). There are two such restraining potentials, at  $\pm z_r$ , which creates a



**Fig. 1.** The difference in the absolute single-ion solvation free energy of the anion and the cation and the osmotic coefficient at 1 m for alkali halide salts.

layer  $2z_r$  thick containing the salt solution. Outside this layer is pure water. The osmotic pressure is simply the force,  $-k_r(z-z_r)$ , that the restraint exerts on the ion divided by the area of the periodic cell in the x and y directions. The osmotic coefficient,  $\phi$ , is the osmotic pressure divided by the ideal solution osmotic pressure, 2c(m)RT, where c(m) is the molality of the salt solution. Notice that the factor of 2 indicates that the ideal solution limit assumes complete ion dissociation. Ion pairing would then tend to decrease the osmotic pressure by having fewer independent particles. These simulations used an orthorhombic box with side x and y side lengths equal to 44Å. The box length in z allowed to vary so as to maintain a constant pressure. The simulations used 5680 water molecules and the appropriate number of ions to give the intended molality. This system size gives a box size in the z direction equal to about 88 Å, half of which contains the salt solution. The molality of the solution is found from the average number of ions from  $-z_r$  to  $+z_r$  divided by the number of water molecules in the same region. All four ion pairs were simulated at a concentration of 1 m and an additional higher concentration. The solutions NaCl and NaI were simulated at 5.0 m, KCl at 4.8 m, the saturation concentration, and KI at 4.5 m, the highest concentration for which an experimental value is available [39]. The 1 m simulations used 104 ions for the NaCl and KCl solutions, 102 ions for the KI solutions, and 100 ions for the NaI solutions. The 5.0 m NaCl solution contained 496 ions, the 4.8 m KCl solution contained 456 ions, the 5.0 m NaI solution 434 ions, and the 4.5 m KI solution contained 430 ions.

**The potential model.** The simulations used a recently developed model which includes both charge transfer and polarizability [42–44]. Charge transfer is treated by allowing charge to be transferred between pairs. The amount of charge transfer depends on the distance between pairs and the model has charges which change every time step, according to the local structure. The TIP4P-FQ+DCT model, which treats polarizability with the fluctuating charge method, is used for water [42]. Polarizability for the ions is treated using the Drude model, in which a charge site is placed on a spring [45,46]. The interaction between two ions *i* and *j* is given by

$$E_{ij} = 4\epsilon_{ij} \left[ \left( \frac{\sigma_{ij}}{r_{i1j1}} \right)^{12} - \left( \frac{\sigma_{ij}}{r_{i1j1}} \right)^6 \right] + \sum_{\alpha\beta} \frac{q_{i\alpha}q_{j\beta}}{r_{i\alpha j\beta}} S_{ij}(r_{i\alpha j\beta}) + \left( -\mu_{ij}^{CT} |q_{ij}^{CT}| + \frac{1}{2} \eta_{ij}^{CT} (q_{ij}^{CT})^2 \right)$$

$$(2)$$

with a Lennard-Jones interaction between the ion centers, Coulombic interactions between all sites on different ions, and a charge transfer energy term. The distance between sites  $\alpha$  and  $\beta$  on ions *i* and *j* is  $r_{i\alpha j\beta}$ , with the first site corresponding to the ion center and the second corresponding to the Drude position. The Coulombic interactions are damped at short-range according to

$$S_{ij}(r_{i\alpha j\beta}) = 1 - \left(1 + \frac{r_{i\alpha j\beta}}{2a_{ij}}\right)e^{-r_{i\alpha j\beta}/a_{ij}}$$
(3)

where  $a_{ij}$  determines the amount of screening. The charge transfer between pairs is distance dependent as given by

$$q_{ij}^{CT} = \begin{cases} Q_{ij}^{CT} & \text{if } r_{1ij1} < R_1^{CT}, \\ \frac{1}{2} Q_{ij}^{CT} [1 + \cos(\pi \frac{r_{i1j1} - R_1^{CT}}{R_2^{CT} - R_1^{CT}})] & \text{if } R_1^{CT} \le r_{i1j1} \le R_2^{CT}, \\ 0 & \text{if } r_{i1j1} > R_2^{CT}, \end{cases}$$
(4)

as characterized by a charge transfer amount,  $Q_{ij}^{CT}$  and two distances, which reduces the charge transfer to zero over the range  $R_1^{CT}$  to  $R_2^{CT}$ . The charge is transferred to the ion center and the Drude charge remains unchanged. No charge is transferred between like

#### Table 1

The Lennard-Jones well-depth,  $\epsilon$ , and radius,  $\sigma$ , the Drude charge and polarizability [43,44].

	$\epsilon$ (kcal/mol)	$\sigma$ (Å)	$q_D(e)$	$\alpha$ (Å <sup>3</sup> )
Na <sup>+</sup>	0.0407	2.320	-0.687597	0.157
K <sup>+</sup>	0.0497	3.030	-1.580968	0.830
Cl-	0.1490	3.720	-4.062989	5.482
I-	0.1854	4.695	-5.562578	10.272

ions. The three charge transfer parameters are taken from quantum calculations and not treated as adjustable. The charge transfer for the ion pairs was chosen so that the amount of charge transfer reproduces the results for an ion in a crystal environment, with the ion surrounded by six nearest counter-ion neighbors. This gives a charge transfer amount for the NaCl of 0.017 *e*, which is in good agreement with a previous study which reported a charge for sodium atom in solid NaCl equal to 0.90 *e*, and so a charge transfer of 0.0167 *e* from each six neighbors [47]. The cut-off distances  $R_1^{CT}$ and  $R_2^{CT}$  are chosen to match the length scales of charge transfer from the quantum calculations.

As in previous studies [34,21,23], the usual Lorentz-Berthelot combining rule for  $\sigma$  is modified by introducing a scaling factor, as given by

$$\sigma_{ij} = \lambda_{ij} \frac{1}{2} \left( \sigma_i + \sigma_j \right) \tag{5}$$

This modification is only used for unlike ion pairs, and Lorentz-Berthelot combining rule  $(\epsilon_{ij} = (\epsilon_i \epsilon_j)^{1/2})$  is used.

The parameters for the charge transfer model are given in Tables 1 and 2. Each ion pair has three parameters which are used for optimization. These are the Lennard-Jones scaling parameter for  $\sigma$ ,  $\lambda_{ij}$ , the Coulombic damping coefficient,  $a_{ij}$ , and  $\mu_{ij}^{CT}$  from the charge transfer energy equation. The other charge transfer energy parameter,  $\eta_{ij}^{CT}$ , was kept fixed, since most properties were not found to be strongly dependent on this term. Only the ion-ion parameters are being optimized, the water-water and water-ion parameters are taken from previous studies [42–44]. The three parameters were fit to reproduce the osmotic coefficient at different concentrations and the optimized ion dimer geometry. We followed a simple optimization procedure in which a value of  $a_{ij}$  was chosen, then a  $\lambda_{ij}$  value was found which gives the correct dimer geometry, then  $\mu_{ij}^{CT}$  was varied to find optimal osmotic coefficients. Then a different value of  $a_{ij}$  was chosen, until an overall best set of coefficients was found.

Simulation details. All simulations were run using our own molecular dynamics program. Simulations were carried out in the isothermal, isobaric ensemble at a temperature of 298K and a pressure of 1 atm, using a Nosé-Hoover thermostat and an Anderson barostat [48]. The charge equilibration for the fluctuating charges is handled via an extended Lagrangian approach [49] using charge normal modes [50,42]. The Drude variables are given a mass equal to 0.4 amu, which is subtracted from the mass of the ion center, and propagated as described by Lamoureux and Roux [51]. The simulations use a 1 fs time step and Ewald summation for the long-range electrostatics [48]. The osmotic pressure simulations were run for at least 14 ns at 1 m and 2 ns at the higher concentrations. Bonds were constrained using the SHAKE algorithm [48]. All bulk salt solution simulations used 2840 water molecules. The 1 m simulations used 104 and the 4.5 m simulations used 460 ions. Calculations of the potential of mean forces and the ion charges as a function of ion pair distance were done with umbrella sampling, with two ions and 2840 water molecules. These calculations used umbrella sampling with umbrella windows separated by 1 Å.

**Quantum calculations.** Quantum theory of atoms in molecules (QTAIM) [52] analysis is carried out for NaCl, KCl, NaI, and KI dimers

and clusters. The NaCl and KCl dimer studies use MP2 with the augcc-pvTZ basis set on Na and Cl and the 6-311++G(2d,2p) basis for K. These studies used the QTAIM analysis software developed by Henkelmann and coworkers [53]. All other studies use the AIMAII software package [54]. Quantum calculations with chloride are carried out in NWChem version 5.1 [55]. Calculations with iodide use Gaussian09 [56]. For iodide, the effective core potential (ECP) MWB46 is used at the Hartree-Fock (HF) level.

To better understand CT in the condensed phase, clusters of ion pairs are studied. A face-centered cubic cell consisting of 27 ions placed at their distances in salt crystals is formed. A single-point calculation is carried out at HF level; due to computational expense, the basis set size was reduced to aug-cc-pvDZ for Na and Cl. Periodic boundary conditions (PBC) are not applied, and the dielectric is  $\varepsilon = 1$ . A calculation was attempted with  $\varepsilon = 6$ , which is more relevant to the solid salt environment but proved to be too computationally demanding. In these "mini-crystal" clusters, the charge of the central ion is calculated. These calculations show that CT per ligand is about half of the CT seen for gas-phase dimers. Calculations on dimers with the dielectric equal to six also show CT half of that for dimers when the dielectric is one.

#### 3. Results

The optimized parameters for the ion pairs, along with previous parameters for the ion water interactions, are given in Table 2. The properties of the optimized models, compared to those used for parameterization, the dimer distance and the osmotic coefficients, are shown in Table 3. The osmotic coefficients for the four salts are shown in Fig. 2. The osmotic coefficients of the model are in good agreement, showing both the dependence on ion pair identity and concentration.

Pair correlation functions between the ion-pairs, at concentrations of 1 m and 4.5 m, show a range of structures (Fig. 3). The ion pairs NaCl and KCl show a contact ion peak around 3 Åas well as a solvent separated peak and a third smaller peak. These pair correlation functions are qualitatively similar to others calculated using



Fig. 2. The osmotic coefficients of the model (symbols) and experiment [39] (lines) as a function of concentration.

Table 2         Charge transfer, electrostatic damping, and Lennard-Jones combining rule parameters for ion pairs and ion-water [43,44].						
	<i>Q<sub>CT</sub></i> (e)	<i>r</i> <sub>CT1</sub> (Å)	r <sub>CT2</sub> (Å)	$\mu_{CT}$ (kcal/mol/e)	$\eta_{CT}$ (kcal/mol/e)	
Na <sup>+</sup> - Cl <sup>-</sup>	0.022	1.8	5.5	381.73	232.35	
K+ - Cl-	0.024	2.0	5.5	332.99	232.35	
Na+ - I-	0.024	2.2	5.5	341.12	232.35	
K+ - I-	0.036	2.3	5.6	324.88	232.35	
Na <sup>+</sup> - H <sub>2</sub> O	0.033	1.7	3.3	275.33	1602.6	

3.7

3.1

3.6

Table 3

Properties used in potential refinement: the optimized dimer distance, compared to the quantum mechanical results and the osmotic coefficients at different concentrations, compared to experiment [39].

304.57

95.51

26.80

	dimer r <sub>min</sub> (Å)		osmotic co	osmotic coefficient			osmotic coefficient		
	Model	QM	<i>c</i> (m)	Model	Experiment	<i>c</i> (m)	Model	Experiment	
NaCl	2.35	2.30	1.0	$0.95 \pm 0.04$	0.936	5.0	$1.21\pm0.05$	1.191	
KCl	2.67	2.67	1.0	$0.90\pm0.04$	0.898	4.8	$0.98\pm0.05$	0.990	
NaI	2.68	2.68	1.0	$1.01\pm0.04$	0.989	5.0	$1.44\pm0.05$	1.415	
KI	3.00	3.10	1.0	$0.93\pm0.04$	0.928	4.5	$1.05\pm0.04$	1.033	

non-polarizable potentials for NaCl [17-19,25,24,33,58,57,59] and KCl [18,19,25,57] including those with ion-ion interactions that have been optimized to reproduce osmotic pressures [21,34] and activities [37]. The pair NaI has the smallest contact pair peak, with a bigger solvent separated peak, in agreement with previous simulations [34,37]. A small contact pair peak for NaI is consistent with it having the largest osmotic pressure. KI has a large contact pair peak and no solvent separated peak. Potential of mean force calculations for KI find a very shallow free energy minimum for the solvent separated peak [18]. A larger contact pair peak for KI, and therefore a bigger amount of ion pairing, is consistent with KI having a small osmotic pressure.

The potentials of mean force, w(r), between ion pairs (from simulations with only the two ions) show similar results to the pair correlation functions (Fig. 4) at higher concentrations. (Each w(r) is adjusted so that the value at a separation of 8 Åis equal to  $-1/4\pi\epsilon_0\epsilon$ , where  $\epsilon_0$  is the vacuum permittivity and  $\epsilon$  is the dielectric constant of the model, 78.) KI has the deepest contact pair minimum and no solvent separated local minimum. NaI has a solvent



Fig. 3. Pair correlation functions for ion pairs at 1 m (solid line) and 4.5 m (dashed line).

separated minimum about as deep as that of the contact pair. The number of contact pairs, N<sub>CP</sub>, can be found by integrating the ion pair correlation function, g(r), over the contact pair peak, as given by

6306.7

-8962

995.8

λ(Å)

1.036

1.065

1.030

1 0 3 5

1.0

1.0

1.0

1.0

а

0.64

0.64

0.69

0 70

0.10

0.10

0.60

0.66

$$N_{CP} = 4\pi\rho_p \int_0^{r_{cut}} g(r)r^2 dr \tag{6}$$

where  $\rho_p$  is the number density of ion pairs [58]. This corresponds to integrating out to a cut-off distance of 3.5 Åfor NaCl, 4.0 Åfor KCl and NaI, and 4.5 Åfor KI. Note that there is an arbitrariness of this definition of an ion pair, given that the pair correlation functions are



Fig. 4. Potential of mean force between ion pairs for NaCl (green dashed line), KCl (black solid line), NaI (blue dot-dashed line), and KI (red dotted line). (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)

 $K^+$ - H<sub>2</sub>O

Cl- - H<sub>2</sub>O

I<sup>-</sup> - H<sub>2</sub>O

0.024

0.057

0.075

2.0

1.9

2.0

Table	4
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Ion pairing, ion clustering for clusters up to size three, and average charge values for salt solutions at different concentrations.

	NaCl		KCl		NaI		KI	
	1 m	4.5 m	1 m	4.5 m	1 m	4.5 m	1 m	4.5 m
N <sub>CP</sub>	0.16±0.01	$0.53\pm0.01$	$0.21\pm0.01$	$0.62\pm0.01$	$0.11\pm0.01$	$0.40\pm0.01$	$0.66 \pm 0.03$	$1.52\pm0.02$
N <sub>CP+SSP</sub>	$\textbf{0.85} \pm \textbf{0.02}$	$2.86 \pm 0.01$	$0.94 \pm 0.03$	$2.90\pm0.01$	$0.69 \pm 0.02$	$2.39\pm0.02$	$1.11\pm0.04$	$2.68\pm0.02$
p(1)	$0.84 \pm 0.01$	$0.558 \pm 0.008$	$0.798 \pm 0.009$	$0.493 \pm 0.006$	$0.891 \pm 0.004$	$0.655\pm0.005$	$0.47\pm0.02$	$0.133 \pm 0.003$
p(2)	$0.067\pm0.006$	$0.117\pm0.003$	$0.085\pm0.004$	$0.125\pm0.001$	$0.049\pm0.002$	$0.110\pm0.001$	$0.133 \pm 0.04$	$0.045\pm0.002$
p(3)	$0.007\pm0.002$	$0.034\pm0.001$	$0.009\pm0.001$	$0.0378 \pm 0.0005$	$0.0032 \pm 0.0004$	$0.0257 \pm 0.0009$	$0.037\pm0.002$	$0.0187 \pm 0.0009$
cation charge (e)	0.899	0.893	0.917	0.907	0.899	0.896	0.914	0.904
anion charge (e)	-0.804	-0.802	-0.800	-0.792	-0.807	-0.801	-0.813	-0.813
water charge (e)	-0.0017	-0.0074	-0.0021	-0.0094	-0.0017	-0.0077	-0.0018	-0.0073

all very close to one at the cut-off distances, but these cut-off distances are reasonable given that they are 1.2 Åto 1.5 Å(or about half an ionic radius) larger than the dimer energy minimum distance (Table 3). The values are given in Table 4. At 1 m, NaCl, KCl and NaI all show about the same amount of ion pairing, from 0.1 to 0.2, which means 10 to 20% of the time an ion is paired. KI shows increased pairing, so that an ion pair is formed about 80% of the time. At higher concentrations, there is more ion pairing, but the increase is not as much as the ratio of the concentrations. This means there is relatively less ion pairing, compared to random chance, as indicated by the contact pair peaks in the pair correlation functions which decrease with concentration. Other studies, for NaCl and KCl solutions, have also seen a decrease in the contact pair with increased concentration [21,25]. These studies find ion pairing fairly close to the CT model results, with  $N_{CP}$  less than 0.5 and smaller for NaCl than KCl, but the results do depend on the water and ion models [17,21,25].

The random probability to have two ions together can be found from Equation 6 by setting g(r) to 1 at all distances beyond an excluded volume radius,  $r_{ev}$ . This gives  $N_{CP}^{random} = (4\pi/3)\rho_p(r_{cut}^3 - r_{ev}^3)$ . Values of  $r_{ev}$  can be found from the pair correlation functions, at the distance where the g(r) first equals 1. This gives values of  $r_{ev}$ equal to 2.45 Å, 2.89 Å, 3.00 Å, and 3.18 Å, for NaCl, KCl, Nal, and KI, respectively. The amount of contact pairing just by random chance, at 1m, is then 0.073, 0.102, 0.092, and 0.144 for NaCl, KCl, Nal, and KI, respectively. For NaCl and KCl, the amount of ion pairing is about a factor of two higher than the random value and for NaI, it is only slightly higher. At 4.5 m,  $N_{CP}^{random}$  will be 4.5 times the value at 1m, giving 0.33, 0.46, 0.41, and 0.65 for NaCl, KCl, NaI, and KI, respectively. At this concentration, only KI has an ion pairing significantly higher than random.

The relationship between ion pairing and osmotic pressure is checked by changing the value of  $\mu_{ij}^{CT}$  which is part of the charge transfer energy term. This term is short-ranged and can be used to change the amount of ion pairing while leaving the rest of the interactions unchanged. The ion pairing for the optimized models and a model with an increased value of  $\mu_{ij}^{CT}$  (and so more ion pairing) are shown in Fig. 5. All models show a decrease in the osmotic coefficient with increased contact pairing, in agreement with previous studies [21,23]. The three ion pairs NaCl, KCl, and NaI all show a similar relationship between contact pairing and osmotic coefficient,  $\phi$ , with KI showing different dependence. The other ions pairs with the large amount of contact pairing seen in KI would be expected to have a much smaller  $\phi$  than that of KI. One noticeable difference between KI and the others from Fig. 3 is the lack of solvent separated pair. Including the solvent separated pair in the definition of an ion pair would lead to relatively more pairing for NaCl, KCl, and NaI (Table 4). This definition of ion pairing, labelled  $N_{CP+SSP}$ , is found by integrating the g(r) to 6 Å. Even with this definition of ion pairing, KI has more pairing than KCl at 1m, although not by that much, but has a larger osmotic coefficient, implying that more than ion pairing is important. Note

that at the higher concentration,  $N_{CP+SSP}$  is larger for KCl than for Kl.

Additional characterization can be done by examining the ion clusters formed in the solutions. Ions are taken to be paired if they are within the cut-off distance,  $r_{cut}$ , given above, and are grouped into larger clusters if any ion is part of more than one pair [30,32]. The cluster distributions are given by p(n), which is the average number of clusters of size n divided by the total number of ions,  $N_{ions}$ . This definition of p(n) is normalized so that the sum over all cluster sizes times the number of ions in that cluster equals 1, or

$$\sum_{n=1}^{N_{ion}} p(n)n = 1 \tag{7}$$

(For example, if only single ions are present, there would be *N*<sub>ions</sub> a particle clusters and p(1) = 1. If all ions are paired in two particle clusters, there would be  $N_{ions}/2$  two particle clusters and p(2)=1/2.) The cluster distributions are shown in Fig. 6(a) and (b) and the values for the smaller clusters are given in Table 3. The NaCl, KCl, and Nal solutions show similar clustering with about 80 to 90% of the ions are unpaired at 1 m. For the KI solution only about half the ions are unpaired at 1 m. A significant fraction of the ions are present as pairs (the values of p(2) are numerically different from  $N_{CP}$  because there is a different normalization and also N<sub>CP</sub> includes ion pairs that are present as part of larger clusters). Larger clusters are also formed. At 1 m, for NaCl no clusters larger than 7 are observed and for NaCl, KCl, and NaI p(n) appears to drop off exponentially. Similar results for NaCl and KCl have been reported by Chen and Pappu [30]. Much larger clusters are observed for KI. At 1 m, clusters up to size 27 are seen and at 4.5 m, there are clusters of around 300 ions, which represents about 2/3 of the total ions of the system. Visual inspection of these large clusters reveals that they are extended



Fig. 5. Osmotic coefficient as a function of contact pair fraction for models variations of the different ion pairs at 1 m.



**Fig. 6.** Ion clusters distributions for solutions of NaCl (green dashed line), KCl (solid line), NaI (blue dot-dashed line) and KI (red dotted line) at concentrations of (a) 1 m and (b) 4.5 m. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)

throughout the solution and do not represent compact crystal-like structures. These clusters are probably driven by a strong tendency for KI to form pairs, which can then form chains. The amount of clustering will depend on the cut-off used for pairing,  $r_{cut}$ , but even if this value is reduced to 4.0 Å(the value used for KCl and NaI) these large clusters are still found.

The clusters can be characterized in terms of composition and structure. The radius of gyration,  $R_G$ , of the clusters as a function of cluster size is shown in Fig. 7. Shown are the results for NaCl and KI at a concentration of 4.5 m. The results for KCl and NaI are very similar to those of NaCl and the results at the lower concentration are similar as well, except larger clusters are not formed. For comparison, the radius of gyration for clusters with a linear geometry and in an NaCl lattice geometry are plotted. For the linear clusters,  $R_G$  increases linearly with cluster size n and for the cubic geometry,  $R_G$  increases as  $n^{1/3}$ . When plotted on a log-log scale, the slopes will give the exponent of the dependence on n. The lines are generated using a nearest neighbor distance of 3.5 Å, appropriate for KI. Up to about a cluster size of 10, the  $R_G$  increases as a linear chain. For the larger KI clusters,  $R_G$  does not increase linearly, but the clusters are still appreciably larger than an ideal (compact) crystal would be.

The composition of the clusters can be described using its formal charge, which gives the relative number of cations to anions. The charge of the clusters in the 4.5 m solution as a function of size is given in Fig. 8. The cluster charges at 1 m are similar. Overall, clusters



**Fig. 7.** Radius of gyration for ion clusters of size n in 4.5 m NaCl (green solid line) and Kl (red dotted line) on a log-log scale. Also shown is the radius of gyration for ideal linear (upper dotted line) and ideal crystal (lower dotted line) clusters. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)



**Fig. 8.** Formal charge of the ion clusters of size n in 4.5 m NaCl (dashed green), KCl (solid), Nal (dot-dashed blue). and KI (dotted red line). (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)

larger than two are positively charged, on average. Of the ions not part of a cluster, there tends to be small preference for anions (since the larger clusters have a preference for cations). This is an excess of anions about 0.1 to 1 % at 1 m and about 2 to 8% at 4.5 m, with KI (having more larger clusters) at the high end.

The charge of an ion as a function of distance between the solvated cation and anion is shown in Fig. 9. This is for a solution with a single ion pair. The anions get more negatively charged when an ion pair is formed, because there is more charge transfer from the anion to water than there is to a cation (see Table 2). The anion



**Fig.9.** The cation (top) and anion (bottom) charge as a function of ion pair separation for NaCl (green dashed line), KCl (black solid line), Nal (blue dot-dashed line) and Kl (red dotted line). (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)

charge is slightly larger around a separation of 4.5 Å, about a half Angstrom greater than the minimum between the contact and solvent separated pairs (see Fig. 4). At this separation, some solvation shell water molecules are lost, resulting in less charge transfer. A more negative chloride ion upon pairing with sodium is seen in analysis of classical potentials using *ab initio* calculations [47]. The charge of the cation changes less upon pairing, because the difference in the cation-anion and cation-water charge transfer amounts are not as large. Similar results for LiF ion pair formation from *ab initio* molecular dynamics have been reported, in which the anion charge changes more than the cation charge as a pair is formed [60].

There is more charge transferred to a water molecule from an anion than from a water molecule to a cation. This results in a net negative charge on the water molecules [44,47]. The average charges of the ions and water are shown on Table 4. An ion pair transfers about -0.1 *e* of a charge to water, on average among these ion types. That charge is shared among the water molecules of the system, probably mostly on the first solvation shell [44,47], and gets larger, per water molecule, as the ion concentration increases. The charge of the water, as a result of charge transfer from an ion, has been shown to have an important influence on water translational diffusion time scales [61].

### 4. Conclusions

Potentials for ions and water which include polarizability and charge transfer have been previously demonstrated to give accurate single ion properties, including hydration free energies and solvent structure [43,44]. By a combination of quantum calculations of ion/water clusters, to determine the amount of charge transfer between ion pairs in solution, and modification of the Lorentz-Berthelot combining rules for the Lennard-Jones interaction, the models can accurately reproduce the osmotic coefficient for concentrated salt solutions (Fig. 2), as has been demonstrated for other potential models [17,33,34,21,23]. Because the osmotic pressure is sensitive to the amount of ion paring [21,23] (and see Fig. 5), these optimized potentials can be used to examine the amount of ion pairing and larger ion cluster formation.

Among the four solutions, NaCl, KCl, and NaI are fairly similar, with contact pair and a solvent separated peaks in the ion-ion pair correlation functions (Fig. 3) and, while the contact pair peaks may appear large, the amount of ion pairing is not that significant. At a concentration of 1 m, 10 -20% of ions are paired; the amount of pairing purely by chance would be about 10%. At a higher concentration of 4.5 m, none of these three pairs demonstrates pairing much larger than random. Clusters larger than pairs are observed, with probability that falls off exponentially with size (Fig. 6(a) and (b)). The KI solution behaves much differently. There is substantially more ion pairing and clustering, so that even at 1m most ions are paired or in larger clusters. The clusters for all four ion types form extended almost linear structures, with no evidence of crystal-type compact structures (Fig. 7).

The cations tend to cluster more than the anions, so that clusters of size bigger than two tend to be positively charged (Fig. 8). This is true for even numbered clusters, as well, which might be expected to have an identical number of anions and cations. A preference for cations in the clusters was seen in previous simulations of NaCl and other alkali halide salts [30,32]. KI and KCl form larger clusters and also tend to have clusters with a smaller anion/cation imbalance. Nal tends to pair and cluster the least, which is consistent with the law of matching affinities, since this pair is the most different in terms of hydration free energies among these four ion pairs (KI is the most similar). We find that the smaller cation forms fewer clusters, in disagreement with previous simulation results using non-polarizable potentials [30,18] indicating that the clustering depends on the details of the potential models, as has been noted [18]. Our results are in agreement with the 2D IR experiments of Bian et al. [27], (with Li<sup>+</sup>, Na<sup>+</sup>, K<sup>+</sup>, and Cs<sup>+</sup> as the cation and SCN<sup>-</sup> as the anion). The osmotic pressure-optimized (non-polarizable) potentials of Luo and Roux find more ion pairing for KCl than NaCl, in agreement with our results [21]. For any of these anions in our study or the others (Cl<sup>-</sup>, Br<sup>-</sup>, I<sup>-</sup>, and SCN<sup>-</sup>), the larger cation would match the water affinity the best, so the larger cations should cluster more. It is surprising that the cations have a stronger tendency to be part of a cluster, since the ions K<sup>+</sup> and Na<sup>+</sup> are more hydrophilic than Cl<sup>-</sup> and I<sup>-</sup>, with larger hydration free energies [40]. This may be because these particular anions are larger than the cations and excess cations can be arranged around the larger anions without being in as close contact as two large anions would be around a cation. Size matching has been proposed to be important for ion pairing [62], and size matching may be a factor for the larger clusters as well.

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