Sodium Carbonate ion complexes modify water structure at electrode interfaces

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Abstract

Water structure near electrode interfaces may play an important role in controlling CO_2 electroreduction. Using plasmon-enhanced vibrational sum frequency generation spectroscopy, we demonstrate the emergence of an interfacial water subpopulation with large electric fields along their OH bonds, when Na_2CO_3 ions are present near the electrode under applied potential. With molecular dynamics simulations, we show that the approach of aqueous Na_2CO_3 to electrodes is coupled to the formation of structured and oriented ion complexes, and that the emergent water population is associated with the first solvation shell of these complexes. This water subpopulation is seen even when the sole source of CO_3^{2-} is its *in-situ* generation from CO_2 , indicating that the interfacial species investigated here are likely ubiquitous in CO_2 electroreduction contexts.

Introduction

Electrochemical CO_2 reduction (CO_2R) offers the promise of converting CO_2 into renewable fuels or value-added chemical feed stocks.^{1–3} However, controlling the efficiency and selectivity of CO_2R remains a significant challenge. While much effort has been devoted to catalyst design, it is also widely reported that the electrolyte composition has a significant effect on reaction kinetics.^{4–10} In electrocatalytic processes, the electrode and the electrolyte represent the two sides of the solid-liquid interface. which forms the local environment for the electron and proton transfer reactions that drive catalysis. The interplay of these two materials, creates a unique interfacial environment where electrode polarization can modulate local electrolyte composition, ion pairing, and the resulting interfacial solvation structure, in turn influencing the electrochemical kinetics that control the viability of critical processes such as CO_2 conversion. Here we use vibrational spectroscopy and molecular simulation to study the electrode-electrolyte interface under conditions relevant to CO_2R . We reveal how ions like Na

and CO_3 , that are prevalent in CO_2 systems, can form correlated ion complexes that modulate electric fields at the interface through their polarization of the surrounding water.

Many reports indicate that the identity of the hydrated cation at the charged interface determines its catalytic activity, although the mechanism behind specific ion effects on CO₂R remains an open question. Early explanations explored the structure of the double layer and the corresponding potential drop across the interface,^{11,12} while more recent studies have shown that interfacial solvation structure can mediate reactions,^{10,13,14} arguing for explicit treatment of solvation in kinetic models of CO_2R .^{15,16} While it is known that the presence of cations at the charged interface is integral for CO₂R activity,¹⁷ the mechanism behind cation-dependent efficiency trends are still widely debated. Possible molecular reasons for the relation between cation identity and efficiency include cationdependent pKa of hydrolysis,¹⁸ cation-specific electric field effects,¹⁹ and the effect of specific cations on the solvation-induced Onsager reaction field present at the interface during $\rm CO_2 R.^{10}$ All of these theories point to the need for a molecular understanding of ion interactions at electrified surfaces and the effect of discrete ions and ion pairs on the alignment and hydrogen-bonding structure of interfacial water.

It is reported that the presence of ion pairs can significantly impact the kinetics of electrochemical reactions.²⁰ While ion pairing in concentrated aqueous solutions is widely reported,^{21,22} comparatively less is known about ion pairing and ion solvation at electrified interfaces, although there is some theoretical evidence that suggestions ion pairing is enhanced near an aqueous electrode interface.²³ Solvent separated ion pairs of alkali halides were observed at negative applied potentials on a silver electrode using surface-enhanced Raman spectroscopy (SERS).²⁴ In that study, the observed SERS spectra of water were shown to depend both on the cation composition and the applied potential, which was explained by the gradual desolvation of cations at negative surface potentials leading the interfacial accumulation of solvent-separated ion pairs. Zou et al. studied the structure of water on silver electrodes in alkali sulfate and perchlorate solutions.²⁵ They found that the effect of the anion on the Raman spectra of water is significant, even at negative potentials. This result is somewhat counterintuitive since anions would be repelled from negatively charged surfaces; however, this was attributed to the formation of ion pairs at the interface.

Ion pair formation in concentrated aqueous solutions can alter the prediction of theories developed for dilute electrolyte solutions 26,27 by modifying osmotic and activity coefficients,²⁸ reducing electronic conductivity,²⁹ and changing the structure of the double layer near charged electrodes.^{30,31} This phenomenology becomes more complex near aqueous interfaces, where ion-interface interactions and modified solvent statistics couple the pairing of ions and their approach to the interface.^{32,33} In particular, a recent series of studies suggests that the reverse fractionation of Na₂CO₃ at the air-water interface, where carbonate ions become more surface active, may arise due to the association of ions into agglomerates near the interface.^{34,35}

Understanding the specific effects of carbonate on interfacial solvation structure and its participation in ion pairing is of particular interest because carbonate is ubiquitous in CO₂saturated aqueous solutions suggesting that it likely plays a role in templating the interfacial solvation during CO₂R. Compared to simple anions such as halides and anions with higher symmetry (sulfate, perchlorate), carbonate has a planar structure, which could have non-intuitive consequences on the alignment of interfacial water. Due to the divalent, polarizable nature of carbonate, its physical interactions at the electrode-electrolyte interface are not trivial to predict. All these factors motivate the present study, which seeks to provide a molecular understanding of the underlying physics, which govern ion interactions and solvation at electrode surfaces in the presence of carbonate.

In this study, we employ vibrational sum frequency generation spectroscopy (VSFG) to probe the alignment of interfacial water in carbonate-containing electrolyte solutions at a gold electrode under applied potentials relevant for CO_2R . We observe potential-dependent differences in the interfacial water spectrum, which are strongly influenced by the presence or absence of the carbonate anion as well as the electrolyte cation. With the aid of molecular dynamics simulations, these spectral differences are correlated with the effect of carbonate on the potential-dependent alignment of interfacial water and the formation of a sodium-carbonate ion complex, which is over-represented near the interface and significantly influences the spectral region of interest.

Methods

Experimental

The specifics of the VSFG system have been discussed in previous work.^{10,14,36–38} Briefly, a Ti: sapphire regenerative amplifier (Spectra Physics-Solstice) with 90 fs pulse duration (2) kHz, 7 W) at 800 nm functions as the pump laser. An optical parametric amplifier (TOPAS Prime) is powered by 70% of this output, which then generates the signal and idler to a noncollinear difference frequency generation (DFG) stage. The remaining 30% is spectrally narrowed to about 10 cm^{-1} using an air-gap etalon (TecOptics). The beams hit the sample at a 56° angle, following the Kretschmann method. The IR beam, centered around 3450 cm^{-1} in the OH stretch region, has an energy of 3 μ J, while the 800 nm picosecond beam has an energy of roughly 10 μ J. For the water spectra measurements, a potential step ranging from -0.1 to -1.0 V against Ag/AgCl was applied to the Au electrode. Each spectrum was gathered by delaying the visible beam relative to the IR beam by approximately 466 fs, with a 2-minute integration time. Further information about the VSFG electrochemical cell can be found in our previous work. This VSFG electrochemical cell uses a backside configuration with plasmonic enhancement, enabling in situ observations of the Au-electrolyte interface at current densities surpassing 1 mA/cm^2 , without the presence of mass transport limitations.

The Au electrodes for VSFG studies were prepared by depositing 35 nm of Au onto CaF_2 windows by electron beam evaporation (Denton DV-502A E-Gun Evaporator). Before Au was deposited, the CaF_2 windows were cleaned using basic Piranha solution (5:1:1 $H_2O/H_2O_2/NH_4OH$) at 80 °C for an hour. The BioLogic SP-50 potentiostat was employed for electrochemical measurements. The electrochemical cell was made up of a Au working electrode, a leakless Ag/AgCl reference electrode (eDAQ ET072-1), and a Pt mesh counter electrode, with a Nafion membrane separating the cathode and anode compartments. The electrolytes were prepared by purging 0.1 M NaHCO₃, 0.1 M CsHCO₃, 0.1 M NaCl (99.99%) and $0.05 \text{ M} \text{ Na}_2 \text{SO}_4$ (99.99%) with either Ar or CO_2 (Praxair, 99.999%) for 20 minutes.

Molecular Dynamics Simulation

To gain microscopic insight into the structure of the three ion Na_2CO_3 complex, its spatial arrangement relative to the interface, and the vibrational spectrum of its solvation shell, we performed a series of MD simulations using the LAMMPS software package.³⁹ We considered dilute aqueous solutions of Na_2CO_3 in the bulk as well as near an electrode. We studied the ions near an electrode at its potential of zero charge as well the anode and cathode of a cell under a 1 V potential drop. Free energy surfaces (FES) for the ion complex were constructed in each chemical environment using a two dimensional umbrella sampling scheme over the distances between the center of mass of the carbonate anion, and each Na⁺ cation denoted r_1 and r_2 .^{40,41} A set of 14 harmonic biases, $U_{\text{bias}}(r_1, r_2) = k_1(r_1 - r_1^{(\text{eq})})^2 + k_2(r_2 - r_2^{(\text{eq})})^2$, was used for each distance coordinate, with minima $r_{1,2}^{(eq)}$, spaced by 0.5Å between 2.5Å and 9.0Å for a grid of 196 bias windows, with a spring constant of $k_1 = k_2 = 10 \text{ kCal/mol/Å}^2$. Each bias window was sampled for at least 1 ns, recording ion configurations every 0.25 ps and water configurations every 1 ps. The Weighted Histogram Analysis Method (WHAM) was then used to construct an unbiased FES from biased simulations, ^{42–45} and to compute unbiased histograms and averages. ⁴⁴ In the electrode simulations, CO₃ was also held at the interface by a harmonic bias with a 10 kCal/mol/Å² in order to probe the interfacial double layer.

Each bulk water simulation contains 234 water molecules, 1 CO_3^{2-} anion and 2 Na^+ cations in a fully periodic $\sim 18 \times 18 \times 18$ Å liquid region, consistent with a dilute 2.6 mM solution. Electrode simulations, instead contained 468 water molecules in a $\sim 18 \times 18 \times 36$ Å liquid region (periodic in x and y), with two atomistic electrodes consisting of 3 layers of Au atoms in an FCC structure with a lattice constant of $a_{\rm Au} = 4.07 \text{\AA}$ truncated to reveal the (100) surface. The electrode interfaces were taken parallel to the xy plane with normal vectors in the $\pm z$ directions. The electrode simulations are large enough to include a bulk-like region between the interfacial regions with a Debye length of ~ 8 Å. The electrodes were treated as ideal conductors $^{46-48}$ as implemented in the LAMMPS ELECTRODE package.⁴⁹ All nonhydrogen electrolyte atoms were modeled with Drude oscillator polarizable forcefield^{50,51} using the LAMMPS DRUDE package⁵² to provide an accurate treatment of the forces on the highly polarizable carbonate anion.^{53–55} Symmetrized Drude force fields were used to improve numerical stability with a Drude mass of $m_D = 0.8$ g/mol.⁵⁶ The system was propagated using a dual Nosé-Hoover thermostat^{50,57} using Nosé-Hoover chains 58,59 at 300 K for the atoms and 1 K for the fictitious Drude sites with a relaxation time of 0.01 fs^{-1} and a timestep of 1 fs. The water was treated using the swm4-ndp model,⁶⁰ and the ions used a polarizable force field previously used to study the air-water interface.⁵⁵ The water molecules and carbonate anion were propagated as rigid bodies using the symplectic rigid-body integrator of Kamberaj et al,⁶¹ freezing all internal coordinates at their equilibrium values.

The vibrational spectra of water's OH bond stretch, relevant to the spectral region of interest, was computed using the field mapping method.^{62–66} In this approach, the electric field is evaluated at each Hydrogen atom is computed and projected along the bond. The frequency of the OH bond stretch, ω , then undergoes a vibrational Stark shift from its vacuum value, ω_0 , due to this projected electric field, ε . In liquid water, this vibrational Stark shift can be fit to experimental Raman spectra or to electronic structure calculations and is well approximated by a linear fit of the form

$$\omega = \omega_0 + \Delta \varepsilon, \tag{1}$$

where $\omega_0 = 3745 \text{ cm}^{-1}$ and $\Delta = 160.5 \text{ cm}^{-1}/(\text{V/Å})$. Using this expression, the vibrational spectra of water is be constructed as histograms of the field along OH bonds. This approach assumes that each OH bond behaves as an independent oscillator, neglecting vibrational coupling between OH bonds, an assumption that is nearly exact for dilute HOD in D₂O but an approximation for pure H₂O. It also assumed that the spectra is purely inhomogeneously broadened. Nevertheless, it has been successfully employed to study multiple forms of vibrational spectroscopy in water.⁶⁷⁻⁷⁰

Results and Discussion

Vibrational Sum Frequency Generation Spectroscopy

VSFG, a surface-specific technique, is widely utilized for studying molecular orientation, dynamics, and chemical reactions on surfaces.^{71–75} The instrument, including the VSFG electrochemical cell, enables in situ measurements of the Au-electrolyte interface at high current densities without mass transport limitations. By employing this instrument, the spectra of interfacial water at the Au-electrolyte interface were measured. The VSFG spectra of interfacial water in 0.05 M Na_2CO_3 and Cs_2CO_3 saturated with CO_2 , plotted as a function of applied potential, are shown in Figure 1. When the potential is more positive than -0.7 V vs Ag/AgCl, Na₂CO₃ and Cs₂CO₃ exhibit guite similar features, and two peaks are observed: one sharp peak at around 3730 $\rm cm^{-1}$ and a broad peak at around 3650 $\rm cm^{-1}$. The sharp peak corresponds to non-hydrogen bounded H₂O molecules, specifically free OH.

Previous studies have reported the detection of free OH stretch of interfacial water at the aqueous dielectric interface using VSFG. However, it has only recently been observed at the Auelectrolyte interface under applied potential.⁷⁶ This feature indicates the presence of interfacial water with one non-hydrogen-bonded OH group directed toward the Au electrode, supporting the hydrophobic nature of the Au surface as observed in previous work by Tong et al.⁷⁶ The broad peak around 3650 cm^{-1} can be assigned to weakly hydrogen-bonded or singly hydrogen-bonded water. The absence of the peak around 3200 cm^{-1} , which corresponds to strongly hydrogen bonded water,⁷⁷ in the spectra presented in Figure 1 suggests that the water structure at the gold electrode surface is relatively disordered as suggested by Nihonyanagi et al. 78

When more negative applied potential, a new peak around $3,400 \text{ cm}^{-1}$ becomes evident for both electrolytes. However, the peak is much more prominent for Na_2CO_3 than Cs_2CO_3 . This peak might be associated with either liquid-like water or a hydrogen-bonded water network with a coordination lower than the tetrahedral water found around 3200 cm^{-1} . In our previous study, this peak was attributed to Na^+ and CO_3^{2-} ion pair or ion association.³⁸ To determine the origin of this feature, we investigated the influence of different electrolyte compositions on the water structure at the interface. NaCl and Na₂SO₄ were chosen to compare with Na_2CO_3 . As shown in Figure 2, the peak is not very pronounced in Ar-purged NaCl and is almost absent in Ar-purged Na₂SO₄ solutions, but is more evident in Ar-purged Na₂CO₃ electrolyte. This observation confirms that the feature around $3,400 \text{ cm}^{-1}$ is enhanced when carbonate is present at the interface. Given these observations, we attribute the feature to the effect of a carbonate species present in the electrochemical double layer on the water structure. We notice that this peak appears at relatively negative potentials. It might be counter intuitive that anions can influence the water orientation at a negatively charged electrode surface. However, despite their negative charge, anions can be attracted to a Au surface even when a

negative potential is applied because of their ion pairing interactions with cations, or because of specific molecular driving forces.⁷⁹ In a previous study by Zou et al., it was discovered that the effect of the anion on the Raman spectra of water is significant, even at very negative potentials. They attributed this to the formation of ion pairs at the electrochemical interface.⁸⁰ The combination of Figures 1 and 2 suggest that the presence of both Na⁺ and CO_3^{2-} is needed to enhance the intensity of the 3400 cm⁻¹ feature, providing indirect evidence for ion pairing interactions.

The carbonate related feature around 3400 $\rm cm^{-1}$ also becomes more prominent in $\rm CO_2$ purged NaCl electrolyte at catalytic potentials compare to Ar-purged NaCl electrolyte as shown in Figure 3. Figure 3(a) shows the potential dependent water spectra of Ar-purged 0.1 M NaCl electrolyte. Even at -1 V, the peak intensity around 3400 cm^{-1} is quite small; however, when the electrolyte was saturated with CO_2 , the peak intensity increased significantly. In CO₂-purged NaCl electrolyte, once the onset of catalytic Faradaic curret is reached, the interfacial pH may increase, and CO_3^{2-} anions are generated at the surface resulting in the appearance of the characteristic 3400 cm^{-1} feature. This suggests that the interfacial species responsible for this features are likely ubiquitious at electrode-electrolyte interfaces during CO_2R electrocatalysis.

Molecular Dynamics Simulations

Taken together, the VSFG results show that a unique sub-population of interfacial water emerges or breaks inversion symmetry when both Na and CO_3^{2-} are present near the cathode. This suggests the formation of interfacial ion-complexes with a unique solvation environment, since the spectral peak emerges most strongly in the presence of both ions. The formation of ion-paired complexes is plausible under the concentrations we consider with typical ion-ion separations on the order of the Na-CO₃ Bjerrum length, $^{26} \lambda_B = 14$ Å, in water. We consider the results of MD simulations to gain microscopic insight into (1) the thermody-



Figure 1: VSFG spectra of (a) Na_2CO_3 (0.05 M) and (b) Cs_2CO_3 (0.05 M) purged with CO_2 as a function of potential vs Ag/AgCl.



Figure 2: VSFG spectra of NaCl (0.1 M), Na₂SO₄ (0.05 M) and Na₂CO₃ (0.05 M) purged with Ar at a potential of -0.9 V vs Ag/AgCl.



Figure 3: VSFG spectra of NaCl (0.1 M) purged with Ar (a) and purged with CO_2 (b) as a function of potential vs Ag/AgCl.

namics of forming Na-CO₃ ion-complexes and how this may change near the interface, (2) the structure of these complexes and their orientation relative to the interface, and (3) the vibrational spectrum and orientation of waters that give rise to the vibrational peak seen in the VSFG spectra.

Free Energy of Ion Complex Formation

Consider the structure of the Na_2CO_3 ion complex near a liquid interface. Since two Na⁺ cations associate with a single CO_3^{2-} anion, two cation-anion distances, r_1 and r_2 are required to describe the complex. Moreover, the cations may become correlated through direct cationcation interactions or through solvent mediated interactions where some configurations of the Na_2CO_3 complex are more favorably solvated than others, requiring the specification of the cation angular displacement, $\theta_{\text{NaCNa}} =$ $\arccos(\hat{\mathbf{r}}_1 \cdot \hat{\mathbf{r}}_1)$, where $\hat{\mathbf{r}}$ is the unit vector associated with the vector **r**. The CO_3^{2-} anion is planar and may exhibit preferential alignment with respect to the interface. This alignment can be captured by the angle $\theta_{\rm CO_3}$ between the normal axis to the carbonate plane and the normal to the interface. These coordinates are show in Fig. 4.A.

Figure 5 shows the two-dimensional the free energy as a function of the two anion-cation separation distances $F(r_1, r_2)$, of the Na₂CO₃ complex in the bulk and interface chemical environments. Similar to the dissociation of simple ion pairs, each cation shows two minima. The most stable configuration is the contact ion pair (CP) at $r_{1/2} < 4.5$ Å, where the sodium ion is in direct contact with the anion. The second minimum is the metastable solventseparated ion pair (SSP) at $4.5 < r_{1/2} < 7$ Å, where the sodium remains near the carbonate anion, with a water molecule separating them. Finally, beyond $r_{1/2} > 7$ Å, the free energy surface plateaus, yielding the dissociated (D) state where the two ions are no longer correlated. These three ion-pairing states are shown schematically in Fig. 4.B.

Near electrode interfaces, the three distinct states are unchanged, but their relative sta-



Figure 4: (A) MD Snapshot of ions and electrodes showing the Carbonate alignment angle, θ_{CO_3} , (green) and cation angular displacement, θ_{NaCNa} , (red). Explicit waters were included in MD simulation but are omitted from this snapshot for clarity. (B) Schematic of Sodium cations (purple spheres) in contact ($r \leq 4.5$ Å, red outline), solvent-separated ($4.5 < r \leq 7$ Å, orange outline) and dissociated (r < 7Å, green outline) states. Representative water molecules are shown.

bility is modified. In particular, the dissociated and solvent-separated states are destabilized relative to the CP minimum. While the magnitude of this effect varies in the different interfacial environments, the direction of the effect is conserved. To better compare free energies across different chemical environments, we compute 1D free energy curves for one cation, conditioned on the ion-pairing state of the other

$$F(r_1|r_2 \in X) \equiv -k_{\rm B}T \log\left[\int_X dr_2 e^{-\frac{F(r_1, r_2)}{k_B T}}\right]$$
(2)

where $X \in \{\text{Contact, Solvent} - \text{Separated, Dissociated}\}$ is the ion-pairing state of cation 2, which we call the auxiliary cation to distinguish it from the probe cation 1.

These conditional free energy curves in Fig. 6, show that in all chemical environments, the probe cation is sensitive to the ion pairing state of the auxiliary cation - increasing as the auxiliary cation dissociates from CO_3^{2-} . In bulk water, the free energy penalty of moving a cation from the contact to solvent-separated state when the other Na is in contact with CO_3 is $4.5 k_{\text{B}}T$ and increases to $5.1 k_{\text{B}}T$ and



Figure 5: Two dimensional Free Energy Surfaces for the dissociation of Na₂CO₃ ion complex, in (A) bulk water, (B) near a neutral electrode interface, (C) near an anode interface at -1 V and (D) near a cathode interface at 1 V. White contours are separated by $k_BT = 0.598$ kCal/mol at T = 300 K. Red lines indicate the cutoff radii r = 4.5 Å and r = 7 Å defining the contact, solvent-separated and dissociated states.



Figure 6: Conditional ion dissociation free energy curves when the carbonate anion is (A) in bulk liquid, (B) near a neutral electrode interface, (C) near an anode, and (D) near a cathode. In each plot Free energies are computed for one sodium cation when the other cation is in contact with (red), solvent-separated from (orange), or dissociated from (green) the carbonate anion. Horizontal lines are spaced by $k_{\rm B}T = 0.598$ kCal/mol at T = 300 K for reference. The Free Energy slices are shifted to align their minimum at the contact ion pair.

 $5.5 k_{\rm B}T$ when the auxiliary ion is in the solventseparated and dissociated states respectively. This net $1 k_{\rm B}T$ destabilization of the contact state relative to the solvent-separated minimum when a second cation is placed near the anion can be explained by the direct Coulomb repulsion between the two cations - agreeing with the expectation of the change in potential energy of $1 k_{\rm B}T$ due to placing an additional +1 charge on the central carbon of CO₃.

As ions approach an electrode interface, both the free energy to dissociate an ion pair and the magnitude of the auxiliary ion effects on dissociation free energy increase. The increased free energy cost of ion dissociation can be partially attributed to the volume excluded by the electrode interface. In bulk water, when Na⁺ is a distance r away from CO_3^{2-} , it can isotropically access every point in a sphere of that radius. When carbonate approaches an interface, part of this sphere would fall within the electrode, which excludes Na^+ from these regions. As a result, the set of configurations consistent with a Na-C distance is truncated by the electrode, leading to a net destabilization of the dissociated state.

This picture is modified slightly near charged electrode interfaces. When CO_3^{2-} is near the cathode, the negatively charged electrode attracts Na⁺ cations bringing them closer to the anion, further penalizing ion dissociation. Near an anode, the opposite occurs, with the positively charged electrode repelling Na⁺ away from CO_3^{2-} , slightly mitigating the excluded volume effect. This destabilization does not explain the increase in auxiliary ion effect. Near a neutral electrode, the free energy cost of moving Na⁺ from the contact to solvent-separated minimum increases from $5.25 k_{\rm B}T$ to $6.5 k_{\rm B}T$ and finally $7k_BT$ when the auxiliary cation is in the contact, solvent-separated and dissociated state respectively. The net auxiliary ion effect of $1.75 k_{\rm B}T$ is nearly double what is seen in bulk water and can not be explained by direct Coulomb repulsion between cations. This discrepancy suggests that the cations become more correlated near the interface due to a change in solvation near the interface.

Interfacial Orientation of Ion Complexes

Thus far, we have restricted our attention to the radial degrees of freedom of the ion complex, averaging over θ_{NaCNa} and θ_{CO_3} . The distributions of these angular coordinates in Fig. 7 show that the orientation statistics of the ion complex are sensitive to both the ion-pairing state of the cations and the type of interface it approaches. In the bulk, Figs. 7A and C show that, as expected, the carbonate ion shows no preferential orientation (solid traces). This changes significantly near an interface. Carbonate in a CP complex aligns orthogonal to electrode interfaces, regardless of the sign or magnitude of their applied potential. This decrease in the coplanar population may arise due to Coulomb repulsion between the negatively charged O atoms in the anion and the image charge induced by the contact paired cations. When a charge approaches a conductor, it induces an image charge of the opposite sign on the surface of the conductor. As a CP complex approaches the anion is simultaneously attracted to its own image charge and repelled by the image charge of the associated cation. While the coplanar configuration maximizes the attractive interaction between carbonate and it's own image charges it also maximizes the repulsion from the image charge of the sodium cation. This interpretation is supported by the slight increase in the population of coplanar carbonates near an anode. The positively charged electrode repels the cation, decreasing its associated image charge and mitigating the drive away from the coplanar configuration. In contrast, SSP complexes show a much weaker alignment bias, and a bistability between orthogonal and co-planar CO_3^{2-} . When the cations are further away from carbonate, the repulsion between the their image charge and the anion's is significantly reduced, decreasing the resulting penalty to the coplanar configuration.

The inter-cation angle, θ_{NaCNa} , shows an even more dramatic dependence on the ion-pairing state and the interface. The contact paired complex, Fig. 7.B, shows a bistability between a linear state where the two cations are on opposite sides of the anion and a bent configuration where they are nearly orthogonal. This bent configuration is stabilized by the presence of a water molecule in CO_3^{2-} 's first solvation shell with the oxygen between the two cations. This bistability is present in all chemical environments with a relative stability that depends on electrode charge. When the anion is close to the anode, the positively charged electrode repels the cation, pushing the complex towards the bent configuration. In contrast, forming the bent configuration near the cathode requires the recruitment of a water with its oxygen brought into contact with the negatively charged electrode. The Coulomb repulsion of the stabilizing oxygen therefore decreases the probability of the bent configuration.

The solvent-separated configuration shows markedly different behavior from the contact ion complex. Instead of a bistable conformation, the solvent-separated species shows a broad range of angular displacements with a sharp peak in a highly bent configuration where a shared water molecule separates both cations from CO_3^{2-} This solvent-separated bent configuration is found in all chemical environments but is significantly enhanced near neutral electrodes and anodes.

Simulated Water Spectra

Finally, we consider how the vibrational spectrum of water is modified by the presence of the ions and electrode. Our goal is to identify the subpopulation of OH bonds that produces the peak around 3400 cm^{-1} in the experimental VSFG spectrum and why this peak emerges only under an applied potential. We begin this analysis by computing the spectrum of all OH bonds in each of the simulations. We find that under all conditions, the total water spectrum was nearly indistinguishable from that of the pure liquid, since only a very small number of water molecules experience a local environment that differs significantly from the pure liquid. In particular, no spectral feature was observed near 3400 cm^{-1} . In Fig. 8.A, we consider the spectrum of only the water molecules within one Debye length (8 Å) of the anode. These interfacial water spectra do not differ significantly from the bulk, and lack any fee ature in the 3400 cm⁻¹ region. Repeating this analysis for only the first water layer, within 3 Å of the interface, also produced spectra that did not differ substantially from the bulk. The experimental signal therefore can not be attributed simply to water near the interface.

Next, we consider only water molecules in the first solvation shell of the anion. Previous simulations of Raman spectroscopy in halide solutions found that ion specific spectral features could be attributed primarily to these waters closest to the ion.⁶³ In order to define the first solvation shell, we consider the hydrogen-carbon (HC) radial distribution function, $q(r_{\rm HC})$ in Fig. 8.C. Under all simulation conditions, the $q(r_{\rm HC})$ shows a local minimum at 3.5 Å defining the cutoff for first solvation shell Hydrogens. Computing the spectrum of only these waters in Fig. 8.B, we see a clear spectral peak emerge at 3400 cm^{-1} . We therefore assign the experimental peak to OH bonds in the first solvation shall of Carbonate. This assignment can be further validated by selecting the OH bonds with a vibration frequency $< 3400 \text{ cm}^{-1}$ and computing $q(r_{\text{HC}})$ for this "High Field" sub-population. In Fig. 8.C we plot the difference between this sub-population $q(r_{\rm HC})$ and that of all Hydrogens for each simulation condition, confirming that the spectral peak can indeed be attributed primarily to the first solvation shell with a small contribution from the second solvation shell. This figure is a statistical assignment of the spectral peak, quantitatively identifying the water subpopulation that is overrepresented in the spectral region of interest.

While this spectral peak is present in all simulation conditions, its characteristics differ between the bulk (solid lines) and interfaces (dashed lines). When a carbonate is near the interface, the primary spectral peak is red-shifted by $\sim 50 \text{ cm}^{-1}$. This shift indicates that the first solvation shell OH bonds typically experience larger fields when carbonate is near an electrode than in the bulk, due to the presence of image charge effects. In addition, we see the presence of a blue shifted feature near 3700 cm-1 when Carbonate is near the interface. The presence



Figure 7: (Left) Histograms of Carbonate orientation, θ_{CO_3} when both Na cations are (A) in contact with or (c) solvent-separated from CO₃. (Center) Histograms of the angular displacement θ_{NaCNa} of the two Na cations when both Na cations are (B) in contact with or (D) solvent-separated from CO₃. Inset figures show sample configurations from different sub-population peaks in the histogram. In all plots, results are shown for CO₃ in bulk water (solid black); a cell with no applied potential in the bulk (solid red), and near the electrode (dashed red); and in a cell with a 1V applied potential in the bulk (solid blue), near the cathode (dotted blue), and near the anode (dashed blue).



Figure 8: (A, B) Simulated vibrational spectra of water OH stretch. The dotted black line shows the bulk water spectrum. Vertical black line at $\omega = 3400 \text{ cm}^{-1}$ indicates the location of the experimental peak. and the maximum frequency (minimum field) for the High Field water population. The remaining traces show the spectrum of OH bonds (A) within a Debye length of the cathode and (B) within the first solvation shell of carbonate ($r_{\rm HC} < 3.5 \text{ Å}$), conditioned on CO₃ being in different chemical environments. (C) Difference in radial distribution function for High Field Hydrogens compared to all Hydrogens in the system. Vertical lines in (C, D) at $r_{\rm HC} = 3.5 \text{ Å}$ indicate the cut-off for first solvation shell Hydrogens. (D) The distribution of OH bond alignments with respect to the electrode interface. Trace colors as described in Fig. 7. In all plots, results are shown for CO3 in bulk water (solid black); a cell with no applied potential in the bulk (solid red), and near the electrode (dashed red); and in a cell with a 1V applied potential in the bulk (solid blue), near the cathode (dotted blue), and near the anode (dashed blue)

of this low-field sub-population of water may indicate the formation of a vacuum region and a partial dewetting of the ion complex itself or of the interface near the ion complex.

Although we have assigned the water subpopulation responsible for the experimental peak, this population is present in similar quantities across all simulation conditions, including bulk water and near a neutral electrode. It remains to show why this peak only emerges in VSFG under an applied potential. Sum frequency generation is a surface-sensitive technique that is sensitive only to regions where inversion symmetry is broken. Therefore, if the orientational distribution of a collection of OH bonds contributing to a spectral feature is inversion symmetric, that feature will not appear in the VSFG spectrum. Noah-Vanhoucke et al^{67} have shown that this breaking of inversion symmetry in water is well-described by considering only the projection of the OH bonds along the z direction orthogonal to the interface. In Fig. 8.D, we consider this orientational distribution for different simulation conditions. In the pure water simulation (black trace), the OH bond distribution is isotropic, indicating that bulk water will not contribute appreciably to the VSFG spectrum - even if it has a sub-population of first solvation shell waters in the spectral range of interest. The orientation distribution near a neutral electrode (red traces), while anisotropic is still inversion symmetric and thus will also not contribute a VSFG signal. When an external field is applied, water molecules near the interface will align in response to the applied field, breaking inversion symmetry and therefore contributing to the VSFG spectrum. The role of the external field is therefore to align the waters in carbonate's solvation shell, rendering them VSFG active and producing the observed experimental signal.

Figure 9 shows a typical configuration from MD simulations highlighting the water molecules characteristic of the VSFG peak at 3400 cm^{-1} . This sub-population of water molecules is found in the first solvation shell of a CO_3^{2-} anion near the interface and displays a clear preferential alignment of their OH bonds,

breaking inversion symmetry and making their vibrations visible in the VSFG spectrum. This prediction of unique water vibrations in the first solvation shell of CO_3^{2-} is consistent with 2DIR studies in bulk water.⁸¹ The proximity to carbonate leads to a large electric field along the OH bonds, producing the observed red shift in the vibrational frequency relative to bulk water, while the charged interface leads to the observed alignment. In addition, the ion complex is shown in its most probable configuration near the cathode. The Na⁺ cations are both in contact with the anion on opposite sides with the plane of CO_3^{2-} orthogonal to the interface. This snapshot should not be understood as an exclusive assignment of the peak, with every water molecule contributing to this spectral region being found in a nearly identical configuration. Instead, it represents the most common structure contributing to the emergent spectral peak, highlighting the conformational properties statistically associated with this spectral region. We note that within this configuration there exist multiple aligned water molecules between the ion pair complex and the surface, which may serve as a proton donor during the coupled proton/electron transfer required for CO_2 activation. However, future studies will be required to evaluate the effect of the observed interfacial water alignment on the CO_2R reaction kinetics.

Conclusion

We have used vibrational sum frequency generation spectroscopy to study the water structure at the interface of carbonate electrolyte solutions and a gold electrode under applied potentials relevant to CO_2R . We observed a peak at around 3400 cm^{-1} at catalytic potentials in the presence of carbonate anions, and this peak is assigned to a sodium-carbonate ion complex, which is over-represented near the interface. The peak is much more prominent for Na_2CO_3 than Cs_2CO_3 suggesting this peak is not only anion specific but also cation specific. Using molecular dynamics simulations, we link these observed spectral changes to the impact

of carbonate on the potential-dependent alignment of interfacial water and the creation of a solvent separated sodium-carbonate ion pair. The peak around 3400 cm^{-1} is assigned to water molecules in the first solvation shell of a CO_3^{2-} anion near the interface, which show a preferential orientation of their OH bonds. This orientation disrupts the inversion symmetry, leading to the visibility of their vibrations in the VSFG spectrum. The solvent-separated configuration of the ion pair shows markedly different behavior from the contact ion complex. Instead of a bistable conformation, the solventseparated ion pairs displays a broad range of angular displacements with a sharp peak in a highly bent configuration with the two sodium ions separated from one another by one water molecule. This solvent-separated bent configuration is found in all chemical environments but is significantly enhanced near electrode surface. These findings reveal ion pairing plays an important role in the structure and alignment of interfacial water under conditions relevant for electrochemical catalysis, including CO₂R and lays the groundwork for future studies to further consider the impact of these structures on the kinetics and mechanisms of electrochemical reactions.



Figure 9: MD snapshot showing the aligned first solvation shell water molecules near the cathode that give rise to the peak in the VSFG spectrum at 3400 cm^{-1} .

Acknowledgements

VSFG measurements were supported by were supported by the Condensed Phase and Interfacial Molecular Science Program (CPIMS), in the Chemical Sciences Geosciences and Biosciences Division of the Office of Basic Energy Sciences of the U.S. Department of Energy under Contract No. DE-SC0020977. The theory and simulations were supported by the Condensed Phase and Interfacial Molecular Science Program (CPIMS), in the Chemical Sciences Geosciences and Biosciences Division of the Office of Basic Energy Sciences of the U.S. Department of Energy under Contract No. DE-AC02-05CH11231.

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