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# Unveiling the Interplay Between Diffusing CO<sub>2</sub> and Ethanol Molecules in Champagne Wines by Classical Molecular Dynamics and <sup>13</sup>C NMR Spectroscopy

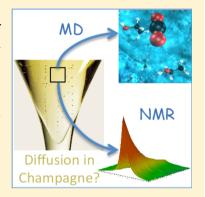
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Supporting Information

ABSTRACT: The diffusion coefficients of carbon dioxide (CO<sub>2</sub>) and ethanol (EtOH) in carbonated hydroalcoholic solutions and Champagne wines are evaluated as a function of temperature by classical molecular dynamics (MD) simulations and <sup>13</sup>C NMR spectroscopy measurements. The excellent agreement between theoretical and experimental diffusion coefficients suggest that ethanol is the main molecule, apart from water, responsible for the value of the CO<sub>2</sub> diffusion coefficients in typical Champagne wines, a result that could likely be extended to most sparkling wines with alike ethanol concentrations. CO2 and EtOH hydrodynamical radii deduced from viscometry measurements by applying the Stokes-Einstein relationship are found to be mostly constant and in close agreement with MD predictions. The reliability of our approach should be of interest to physical chemists aiming to model transport phenomena in supersaturated aqueous solutions or water/alcohol mixtures.



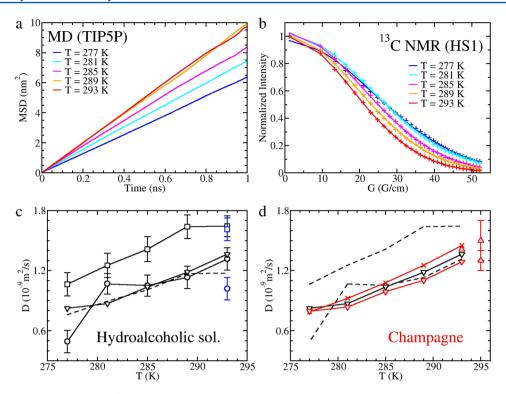
**SECTION:** Liquids; Chemical and Dynamical Processes in Solution

arbon dioxide  $(CO_2)$  supersaturation occurs in a wide variety of aqueous multicomponent systems from inland waters and brines to sparkling beverages. Inland waters such as rivers, lakes, and wetlands are often supersaturated with CO2 and play a major role in the evasion of petagrams of CO2 into the atmosphere, then contributing to the global carbon cycle. 1-3 Evaluating the yields of CO<sub>2</sub> evasion by temperature, alkalinity, and pH measurements coupled to morphological studies of the wide surface areas from which CO2 escapes thus allows to rationalize better the anthropogenic contribution to CO<sub>2</sub> emissions with respect to natural sources of CO<sub>2</sub> production. CO<sub>2</sub> emission at the interface between a supersaturated aqueous solution and a gas phase is also one of the two physical phenomena accounting for the loss of CO2 in sparkling beverages such as Champagne wines.<sup>4</sup> The second path to CO<sub>2</sub> emission in carbonated beverages is related to the very much sought after and so-called effervescence process. Effervescence refers to the formation of bubbles by nonclassical heterogeneous nucleation from tiny gas pockets trapped within immersed particles such as cellulose fibers, crystals, or within possible scratches or etchings done at the surface of the glass.<sup>5</sup> Provided that the radius of curvature of the gas pocket trapped within the particle exceeds a critical radius (of order of 0.2  $\mu m$ at the opening of a champagne bottle), the diffusion of dissolved CO2 within the gas pocket becomes thermodynami-

cally possible. Gaseous CO2 bubbles therefore progressively grow within the particle, to finally be released in the champagne bulk into the form of characteristic bubble trains.<sup>5</sup> Force field molecular dynamics simulations based on TIP5P water models have recently suggested that  $CO_2$  diffusion coefficients at T =293 K could be predicted<sup>6</sup> by simply modeling champagne as a hydroalcoholic solution supersaturated with CO<sub>2</sub>. Although the approach followed by the authors could be applicable to a wide range of liquids supersaturated with gases (eg, CO<sub>2</sub>, methane, etc.), the SPC/E water model, supposed to be reliable for modeling the diffusion of CO<sub>2</sub> in water<sup>6-8</sup> and sometimes used to model water/alcohol mixtures,9 was found to strongly underestimate CO2 diffusion coefficients. Moreover, comparative diffusion coefficients of dissolved CO2 in various carbonated beverages (including a standard Champagne wine) were only determined through the nuclear magnetic resonance (NMR) technique at a single temperature of 293 K. 10 A thorough temperature-dependent study would therefore be valuable for both evaluating the performance of MD simulations to model such systems and better apprehending the

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**Figure 1.** (a) Mean squared displacements (MSDs) of CO<sub>2</sub> centers of mass in a carbonated TIP5P water/ethanol mixture at temperatures ranging from 277 to 293 K. (b) <sup>13</sup>C NMR peak position of <sup>13</sup>CO<sub>2</sub> in a carbonated hydoalcoholic sample (HS1) at temperatures ranging from 277 to 293 K. The plus signs represent experimental data points whose nonlinear fit is depicted as a solid curve. (c) CO<sub>2</sub> diffusion coefficients in carbonated hydroalcoholic solutions deduced from TIP5P MD runs (black squares), SPC/E MD runs (black circles), and <sup>13</sup>C NMR spectroscopy measurements (black downward triangles). The blue symbols represent TIP5P and SPC/E results from the literature. The dashed line is obtained by dividing the TIP5P curve by an empirical factor of 1.4. (d) CO<sub>2</sub> diffusion coefficients in common Champagne wines deduced from <sup>13</sup>C NMR spectroscopy measurements (red downward triangles), NMR spectroscopy measurements from the literature (red upward triangles), <sup>10,14</sup> and the Stokes–Einstein relationship of eq 1 (red crosses). The dashed curves refer to the TIP5P and SPC/E diffusion coefficients plotted in panel c.

influence of temperature on bubble dynamics and subsequently on some tasting sensations.

The main goal of this work is to characterize the interplay between  $\mathrm{CO}_2$  and ethanol (EtOH) molecules in standard Champagne wines as a function of temperature in order to demonstrate that EtOH is the principal molecule responsible for the value of  $\mathrm{CO}_2$  diffusion coefficients in these multicomponent liquids. This assertion is supported by extensive classical molecular dynamics (MD) simulations and  $^{13}\mathrm{C}$  NMR spectroscopy measurements that aim to evaluate  $\mathrm{CO}_2$  and EtOH diffusion coefficients. These diffusion coefficients, combined to experimental and theoretical viscosities, will also be shown to provide  $\mathrm{CO}_2$  and EtOH hydrodynamical radii that nearly match the root-mean-squared (rms) atomic distance to the molecular center of mass, which promises a wide applicability of our approach.

Our MD simulations make use of GROMACS version 4.5.5<sup>11</sup> coupled to the CHARMM27 force field. Despite their multicomponent nature, champagnes can be considered as carbonated hydroalcoholic mixtures in first approximation. The simulation box then contains 10 000 water molecules, described within the SPC/E or TIPSP water model, 440 ethanol molecules and 50 CO<sub>2</sub> molecules, reflecting the typical molecular proportions in Champagne wines. [Champagnes typically hold 12.5% vol/vol of ethanol and 12 g/L of dissolved CO<sub>2</sub> (following the so-called Henry's law which states that the equilibrium concentration of dissolved CO<sub>2</sub> is proportional to the partial pressure of gas phase CO<sub>2</sub>). Sugars are neglected in the present simulations since we focus our discussion on

standard commercial champagnes, namely brut champagnes (<12g/L of sugars, that is, a maximum of six saccharose molecules in our simulation box) that roughly represent 83% of worldwide exportations (a pie chart representing 2013 Champagne wine shipments is provided in page S2 of the Supporting Information). Simulations at five temperatures relevant for applications on Champagne wines, namely 277 K (fridge temperature), 281 and 285 K (cellar and tasting temperature), and 289 and 293 K (room temperature), are performed and subsequently used for evaluating CO2 and EtOH diffusion coefficients (additional details concerning MD simulations are supplied in pages S1-S3 of the Supporting Information). These coefficients are derived from the calculation of the mean-squared displacement (MSD) of CO<sub>2</sub> and EtOH centers of mass in a three-dimensional space, MSD(t) = 6 Dt, then assuming that the  $CO_2$  and EtOH fluxes can be represented by common first Fick's laws with effective diffusion coefficients that encompass the effects of CO2 and EtOH concentration gradients. As illustrated in Figure 1a for MD simulations based on the TIP5P water model, MSD curves obtained for CO<sub>2</sub> molecules are almost perfectly linear at any temperature (the MSD curves corresponding to SPC/E water models are given on page S3 of the Supporting Information), which confirms that the probability density of CO<sub>2</sub> molecules should be Gaussian and therefore validates the assumption made on the expression of fluxes in terms of effective diffusion coefficients.

In order to evaluate unambiguously the quality of TIP5P and SPC/E MD simulations, translational diffusion coefficients

were measured by <sup>13</sup>C NMR spectroscopy in a model mixture (87.5:12.5 (v/v) H<sub>2</sub>O:EtOH) and in a standard commercial brut Champagne wine sample (Veuve Clicquot, Marne, France). Our highly sensitive spectrometer, with a large magnetic field (B = 14T) and a state-of-the-art cryoprobe (coil at T = 20K), is well suited for providing reliable measurements over a broad range of temperatures and discussing the accuracy of previous NMR measurements 10,14 (details on the NMR protocol and NMR data are given in pages S3-S6 of the Supporting Information). It is also worth noting that no CO2 bubble, which might bias experimental measurements, can form in NMR tubes. Indeed, a large amount of dissolved CO<sub>2</sub> is lost through outgassing when filling sample tubes with native champagne, so that dissolved CO2 concentration most probably falls below the critical concentration, enabling heterogeneous bubble nucleation. 15 This loss of CO<sub>2</sub> is somewhat compensated by the addition of NaH<sup>13</sup>CO<sub>3</sub>, then improving at the same time the <sup>13</sup>C NMR signal. Due to the weak interactions between the relatively rare (0.5% of the total number of molecules) nonpolar CO<sub>2</sub> molecules, we assume in NMR experiments that deviations due to smaller CO2 concentrations should lie below experimental uncertainties ( $\sim$ 5%, the size of symbols in Figure 1). As illustrated in Figure 1b for a sample containing a carbonated hydroalcoholic solution, diffusion coefficients are then determined by fitting a series of 32 intensities of <sup>13</sup>CO<sub>2</sub> signals at each temperature of interest.

Diffusion coefficients derived from <sup>13</sup>C NMR spectroscopy measurements in carbonated hydroalcoholic solutions (black downward triangles in Figure 1c) are found in excellent agreement with SPC/E results above 281 K. The SPC/E model is a reparameterization of the SPC model that includes polarization effects in order to improve the reliability of water properties, such as radial distributions, diffusion constants and densities, at temperatures about 300-305 K.16 It is therefore not expected to reproduce the water density maximum at T =277 K much better than the standard SPC model. On the contrary, the TIP5P model was devised to better reproduce water density at this temperature. 17 Although TIP5P diffusion coefficients overestimate experimental data by 30-40%, they are perfectly parallel to the experimental curve, even at low temperature, and a simple division of these coefficients by an empirical factor of 1.4 (dashed line in Figure 1c), in order to compensate the excessive TIP5P diffusivity, significantly improves the agreement with experiments at 277 K  $\leq$  T  $\leq$ 289 K. This overestimation can be partly related to results obtained on water self-diffusion coefficients, 18 where the TIP5P diffusion coefficient ( $D = 2.62 \pm 0.04 \times 10^{-9} \text{m}^2/\text{s}$ ) was found to slightly overestimate the experimental value ( $D = 2.3 \times$  $10^{-9}$ m<sup>2</sup>/s) and the diffusion coefficient predicted by the SPC/E model (D = 2.49  $\pm$  0.05  $\times$  10<sup>-9</sup>m<sup>2</sup>/s) at T = 298 K. A slight overestimation has also been recently observed at T = 293 K for CO<sub>2</sub> diffusion in water,<sup>6</sup> where the TIP5P diffusion coefficient  $(D = 2.36 \pm 0.09 \times 10^{-9} \text{m}^2/\text{s})$  was  $\sim 12\%$  higher than the SPC/ E diffusion coefficient ( $D = 2.11 \pm 0.14 \times 10^{-9} \text{ m}^2/\text{s}$ ). However, we cannot exclude the fact that our model for ethanol, based on the CHARMM27 force field, is also in part responsible for this overestimation. Based on these observations, we would recommend the SPC/E model for evaluating diffusion coefficients in such aqueous solutions at temperatures 285 K  $\leq T \leq$  300 K (higher temperatures are not relevant for wine research, especially when considering sparkling beverages) and the TIP5P model at lower temperatures, provided that one

SPC/E or experimental value of diffusion coefficient is available at higher temperature to estimate any possible scaling factor.

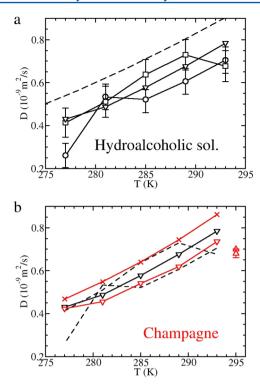
The impressively good agreement obtained above 281 K when the SPC/E model is used also contrasts with the poor agreement obtained with this model in previous studies at T =293 K (blue circle in Figure 1c). The newly gained reliability seems to come from an improved equilibration stage where standard canonical (NVT) equilibrations are replaced by replica exchange molecular dynamics (REMD) simulations in the isothermal-isobaric (NPT) ensemble. Without any REMD simulation, the average enthalpy of the system is indeed -4.14  $\pm 0.2 \times 10^5$  kJ/mol, whereas it increases to  $-4.09 \pm 0.2 \times 10^5$ kJ/mol as a REMD equilibration stage is performed, a difference that was identified to be mainly due to smaller Coulomb short-range interactions in the former simulation. In contrast, the average enthalpy for systems with TIP5P water molecules (black and blue squares in Figure 1c) remains ca.  $-3.51 \times 10^5$  kJ/mol when replica exchange equilibrations are performed. Knowing that no major energy barrier should exist in our model carbonated hydroalcoholic solution, the discrepancy observed in former SPC/E simulations probably came from an incomplete equilibration stage that might have been overcome by performing longer NPT simulations.

 ${
m CO_2}$  diffusion coefficients derived from  $^{13}{
m C}$  NMR measurements on typical brut champagnes (red downward triangles in Figure 1d) are found to nearly match experimental  ${
m CO_2}$  diffusion coefficients obtained in carbonated hydroalcoholic solutions, with a gap between the two curves that does not exceed  $0.8 \times 10^{-10} {
m m}^2/{
m s}$ . These coefficients are also in very close agreement with diffusion coefficients estimated by applying the Stokes–Einstein formula (red crosses in Figure 1d)

$$D = \frac{k_{\rm B}T}{6\pi\eta R} = \frac{k_{\rm B}T}{6\pi R (1.08 \times 10^{-7} {\rm e}^{2806/T})}$$
(1)

where  $k_{\rm B}$  is the Boltzmann constant, T (K) is the temperature,  $\eta$  (Pa·s) is the viscosity that follows an Arrhenius-like law adjusted on viscometry measurements performed on standard commercial champagne (from coopérative Nogent l'Abbesse, Marne, France),  $^{19^{4}}$  and R (m) is the hydrodynamical radius of the diffusing molecule that is assumed to roughly match the rms atomic distance to the CO<sub>2</sub> center of mass ( $R_{\rm CO_2} \approx 0.95 \, \text{Å}$ in our simulations) deduced from MD simulations. The good correspondence between the values of CO2 diffusion coefficients obtained for champagne wines and carbonated hydroalcoholic solutions indicates that glycerol molecules and sugars, the next more abundant species that could increase the viscosity of champagnes, probably have minor effect on the value of CO<sub>2</sub> diffusion coefficients. Ethanol is therefore the main molecule, apart from water, responsible for the value of the CO<sub>2</sub> diffusion coefficient, although champagne is a multicomponent mixture composed of a large number of species, from monatomic ions to sugars and macromolecules. The previous results then confirm that modeling champagnes as carbonated hydroalcoholic solutions by using common water models is sufficient to capture most of the physical effects involved in CO2 diffusion in these systems.

As illustrated in Figure 2a, SPC/E and TIP5P EtOH diffusion coefficients essentially surround the diffusion coefficients deduced from <sup>13</sup>C NMR measurements on carbonated hydroalcoholic solutions. The TIP5P model remains more accurate than the SPC/E model at low



**Figure 2.** (a) EtOH diffusion coefficients in carbonated hydroalcoholic solutions deduced from TIPSP MD runs (black squares), SPC/E MD runs (black circles), and <sup>13</sup>C NMR spectroscopy measurements (black downward triangles). The dashed curve represents empirical results for the infinite dilution of EtOH in pure water.<sup>20,21</sup> (b) EtOH diffusion coefficients in common Champagne wines deduced from <sup>13</sup>C NMR spectroscopy measurements (red downward triangles), NMR spectroscopy measurements from the literature at 295 K (red upward triangles), <sup>14</sup> and the Stokes–Einstein relationship of eq 1 (red crosses). The dashed curves refer to the TIPSP and SPC/E diffusion coefficients plotted in panel a.

temperature, and we can check that all these curves lie roughly  $0.1-0.2 \times 10^{-9}$  m<sup>2</sup>/s below empirical diffusion coefficients obtained for infinitely diluted ethanol in water, the upper limit that EtOH diffusion coefficients should not exceed since ethanol increases the viscosity of liquids, over the full temperature range from 277 to 293 K (dashed line in Figure 2a). From a quantitative point of view, EtOH diffusion coefficients are roughly half as big as CO2 diffusion coefficients, and differences between SPC/E and TIP5P models seem softened, whereas their overall mixture enthalpy differs by ~14%. This unexpected behavior can be partly explained in terms of the average number of H bonds (H bonds are defined by purely geometric considerations<sup>6,22</sup> based on the "g hbond" tool supplied in the GROMACS version 4.5.5 distribution) per molecule, which hardly reaches 0.3-0.5 for CO<sub>2</sub> but increases to 2.5-2.7 for EtOH, over the whole temperature range investigated here. Consequently, CO2 rather diffuses as a spectator species in the network formed by water and EtOH molecules, a behavior already postulated elsewhere,<sup>6</sup> and it is strongly influenced by stability alterations of the hydroalcoholic mixture. A drop in enthalpy, as observed with the TIP5P water model, will yield a smaller "caging" of CO2 molecules and a possible increase of their diffusivity (see Figure 1c). On the contrary, EtOH molecules form more H bonds with their environment, their diffusivity is decreased compared to CO<sub>2</sub> molecules, and differences in water models have weaker

dynamic effects on these less mobile species (see Figure 2a). The small shift of  $0.1-0.5\times 10^{-10}$  m²/s between  $^{13}$ C NMR measurements performed in carbonated hydroalcoholic solutions (black downward triangles in Figure 2b) and Champagne wines (red downward triangles in Figure 2b) also reveals that the value of EtOH diffusion coefficients should not be influenced significantly by molecules other than water and CO<sub>2</sub> in brut champagnes. MD-based diffusion coefficients essentially lie in between semiempirical diffusion coefficients based on eq 1 with  $R_{\rm EtOH}\approx 1.6$  Å (red crosses in Figure 2b) and NMR spectroscopy measurements (red downward and upward triangles in Figure 2b). With regard to experimental and theoretical uncertainties, all these diffusion coefficients can therefore be considered to be in very close agreement.

It is a matter of fact that diffusion coefficients in sparkling beverages can be easily determined from viscosities by applying the Stokes–Einstein relationship (see eq 1) provided that the hydrodynamical radii of diffusing molecules are known. In a previous work, we found that simply defining the  $\rm CO_2$  hydrodynamical radius as the rms atomic distance to the  $\rm CO_2$  center of mass was sufficient to reproduce the typical viscosity of champagnes at T=293 K, but the validity of this empirical definition was not evaluated at lower temperatures and for larger molecules. We first report in Table 1 theoretical

Table 1. Viscosities ( $10^{-3}$  Pa·s) of Hydroalcoholic Solutions and Champagne Wines as a Function of Temperature (277 K  $\leq T \leq$  293 K) for the Mixtures Considered in MD Simulations (Columns 2 and 3) and for Hydroalcoholic Samples (HS) and Champagne Samples (CS) Typically Used in  $^{13}$ C-NMR Measurements (Columns 4 and 5) $^a$ 

T (K)	$\eta_{ ext{SPC/E}}$	$\eta_{ ext{TIP5P}}$	$\eta_{ m HS}$	$\eta_{\mathrm{CS}}$	$\eta_{ m CL}$
277	$2.46 \pm 0.84$	$1.56 \pm 0.01$	2.602	2.885	2.709
281	$1.89 \pm 0.65$	$1.35 \pm 0.01$	2.245	2.460	2.345
285	$1.48 \pm 0.33$	$1.75 \pm 0.46$	1.955	2.136	2.039
289	$1.63 \pm 0.42$	$1.15 \pm 0.18$	1.718	1.856	1.779
293	$1.32 \pm 0.33$	$1.26 \pm 0.19$	1.523	1.636	1.558

 $^a$ Column 6 reports brut champagne viscosities from the literature (CL). $^{23}$ 

viscosities calculated from MD simulations by evaluating the transverse current autocorrelation functions (we used the g tcaf GROMACS tool for this purpose), dynamical viscosities deduced from viscometry measurements (details on these experiments are given in pages S4 and S5 of the Supporting Information), and viscosities from the literature.<sup>23</sup> Despite the large uncertainties, SPC/E viscosities are in good agreement with dynamical viscosities measured in hydroalcoholic solutions. TIP5P viscosities are underestimated as expected from the overestimation of CO<sub>2</sub>, and to a lesser extent EtOH, diffusion coefficients when this water model is used. Both viscosities measured on brut champagnes lie above the viscosity of the hydroalcoholic solution and they only differ by ~5%, a deviation that can be attributed to the composition of these two sparkling beverages and to experimental uncertainties. The dynamical viscosities are then combined with <sup>13</sup>C NMR CO<sub>2</sub> and EtOH diffusion coefficients to provide an experimental estimate of the CO<sub>2</sub> and EtOH hydrodynamical radii from the Stokes-Einstein relationship. Table 2 compares these experimental estimations of hydrodynamical radii with theoretical radii derived from MD diffusion coefficients and viscosities at 277 K  $\leq T \leq$  293 K. Experimental hydrodynamical radii are

Table 2. Hydrodynamical Radii (Å) of CO<sub>2</sub> and EtOH Obtained by Applying the Stokes-Einstein Relationship<sup>a</sup>

	$CO_2$				EtOH			
T (K)	$R_{ m SPC/E}$	$R_{ m TIP5P}$	$R_{\mathrm{HS}}$	$R_{\rm CS}$	R <sub>SPC/E</sub>	$R_{ m TIP5P}$	$R_{\mathrm{HS}}$	$R_{CS}$
277	$1.68 \pm 0.96$	$1.22 \pm 0.14$	0.95	0.88	$3.16 \pm 1.76$	$3.14 \pm 0.54$	1.81	1.66
281	$1.02 \pm 0.45$	$1.22 \pm 0.13$	1.05	1.00	$2.04 \pm 0.93$	$2.98 \pm 0.44$	1.88	1.83
285	$1.34 \pm 0.44$	$0.84 \pm 0.30$	1.03	0.99	$2.70 \pm 0.92$	$1.87 \pm 0.70$	1.85	1.81
289	$1.15 \pm 0.41$	$1.12 \pm 0.26$	1.04	1.03	$2.14 \pm 0.76$	$2.52 \pm 0.64$	1.82	1.84
293	$1.24 \pm 0.41$	$1.04 \pm 0.22$	1.03	1.02	$2.31 \pm 0.78$	$2.52 \pm 0.65$	1.80	1.78

 $<sup>^{</sup>a}R_{SPC/E}$  and  $R_{TIPSP}$  are deduced from the theoretical diffusion coefficients and viscosities that correspond to MD simulations including SPC/E and TIPSP water molecules, respectively.  $R_{HS}$  and  $R_{CS}$  are deduced from  $^{13}$ C-NMR diffusion coefficients and viscometry measurements on carbonated hydroalcoholic samples (HS) and champagne samples (CS). Experimental uncertainties are estimated to remain below 0.04 Å.

little temperature-dependent ( $R_{\rm CO_2}\approx 1$  Å and  $R_{\rm EtOH}\approx 1.8$  Å) and they only decrease by 1% to 10% in champagnes compared to carbonated hydroalcoholic solutions. Their deviation from the empirical rms estimates ( $R_{\rm CO_2}\approx 0.95$  Å and  $R_{\rm EtOH}\approx 1.6$  Å) does not exceed ~10% for  ${\rm CO_2}$  and ~18% for EtOH, and the agreement with theoretical hydrodynamical radii, namely  $R_{\rm SPC/E}$  and  $R_{\rm TIPSP}$ , is also qualitatively correct. This confirms the suitability of our simple definition of hydrodynamical radii for relatively small diffusing molecules and the relevance of the Stokes–Einstein relationship for evaluating viscosities or diffusion coefficients in supersaturated aqueous solutions such as Champagne wines.

In this Letter we compared CO<sub>2</sub> and EtOH diffusion coefficients deduced from classical molecular dynamics simulations, 13C NMR spectroscopy measurements, and semiempirical formulas based on an Arrhenius-like law to unveil the interplay between CO2 and EtOH molecules in Champagne wines. We showed that experimental and theoretical diffusion coefficients are in very close agreement to each other and that carbonated hydroalcoholic solutions can be considered as proper models to investigate CO2 and EtOH diffusion in Champagne wines. In particular, EtOH was shown to be the main molecule responsible for the value of CO<sub>2</sub> diffusion coefficients in these beverages, and probably in most sparkling wines with alike ethanol concentrations provided that sugars are not in large amount in the solution, which is true for standard commercial champagnes, namely brut champagnes. In other words, there should be no major correlation between the taste of such sparkling wines, mainly due to acids, sugars, and proteins in the mixture, and the formation and growth dynamics of CO<sub>2</sub> bubbles that mainly relies on CO<sub>2</sub> diffusion. Moreover, CO<sub>2</sub> diffusion seems more sensitive to alterations in water models than EtOH molecules, a property that was partly attributed to the larger propensity of EtOH molecules to participate in the H bonding network, making these molecules less mobile by nature and therefore less prone to dynamic changes. CO2 and EtOH hydrodynamical radii deduced from the insertion of theoretical or experimental viscosities in the Stokes-Einstein relationship were also found to be in good agreement with the predictions given by the rms atomic distance to molecular centers of mass. This simple empirical definition of hydrodynamical radii could therefore be used as first approximation to evaluate diffusion coefficients or viscosities in liquids, and especially in water/alcohol mixtures commonly used as solvents in physical chemistry.

## ASSOCIATED CONTENT

# S Supporting Information

Theoretical details on classical MD simulations (MD protocol, table with the model mixture properties, supplementary MSD curves for  $\rm CO_2$  and EtOH, tables with diffusion coefficients), empirical model from the literature, experimental details on  $^{13}\rm C$  NMR spectroscopy measurements (sample preparation and additional  $^{13}\rm C$  NMR data curves) and viscometry measurements (table with experimental densities and kinematic viscosities). This material is available free of charge via the Internet at http://pubs.acs.org.

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#### Notes

The authors declare no competing financial interest.

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