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# 1 Vapor Pressure of Water Nanodroplets

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6 **S** [Supporting Information](#page-5-0)

 ABSTRACT: Classical thermodynamics is assumed to be valid up to a certain length-scale, below which the discontinuous nature of matter becomes manifest. In particular, this must be the case for the description of the vapor pressure based on the Kelvin equation. However, the legitimacy of this 11 equation in the nanoscopic regime can not be simply established, because the 12 determination of the vapor pressure of very small droplets poses a challenge 13 both for experiments and simulations. In this article we make use of a grand canonical screening approach recently proposed to compute the vapor pressures of finite systems from molecular dynamics simulations. This scheme is applied to water droplets, to show that the applicability of the 17 Kelvin equation extends to unexpectedly small lengths, of only 1 nm, where the inhomogeneities in the density of matter occur within spatial lengths of 19 the same order of magnitude as the size of the object. While in principle this



20 appears to violate the main assumptions underlying thermodynamics, the density profiles reveal, however, that structures of this

21 size are still homogeneous in the nanosecond time-scale. Only when the inhomogeneity in the density persists through the

22 temporal average, as it is the case for clusters of 40 particles or less, do the macroscopic thermodynamics and the molecular

<sup>23</sup> descriptions depart from each other.

# I. INTRODUCTION

 In describing the physical properties of matter, there is a certain length-scale for which the assumptions of classical thermody- namics break down because the discrete nature of matter becomes manifest. How and when this transition takes place between the macroscopic and the nanoscopic domains is one of the most intriguing questions in statistical mechanics and in 30 many areas within condensed and soft matter sciences.<sup>1−4</sup> The 31 vapor pressure an[d](#page-5-0) the surface tension are two paradi[gm](#page-5-0)atic examples of those collective features that can not be grasped by a continuous thermodynamical approach when it comes to tiny droplets and nanoparticles.<sup>5−7</sup> Yet, the comprehension of these two properties is highly re[leva](#page-5-0)nt, not only from a fundamental, chemical-physics standpoint, but also because they determine 37 processes of central interest in materials engineering and catalysis,1,3,8−<sup>11</sup> as well as in environmental and atmospheric chemistr[y,](#page-5-0) [wher](#page-5-0)e they appear as essential ingredients in classical 40 nucleation theory  $(CNT)$ .<sup>12-14</sup> In particular, an accurate assessment of the vapor [pre](#page-5-0)s[sur](#page-5-0)e of nanoaggregates is not easily accessible via experiments, neither through calculations.<sup>7</sup> 43 The Kelvin equ[a](#page-5-0)tion provides the vapor pressure  $(P_v)$  of a droplet as a function of the radius of curvature r of the interface:

$$
\ln \frac{P_v}{P_0} = \frac{2\sigma}{r\rho RT} \tag{1}
$$

where  $P_0$  is the vapor pressure of the bulk substance,  $\sigma$  is the 47 surface tension,  $\rho$  is the density of the condensed phase, R is 48 the gas constant, and  $T$  is the temperature. For very small  $49$ droplets of just a few nanometers of diameter, the effect of <sup>50</sup> curvature on surface tension starts to be important. This can be <sup>51</sup>  $accounted$  for through the Tolman equation<sup>[5](#page-5-0)</sup>  $52$ 

$$
\frac{\sigma}{\sigma_0} = \frac{1}{1 + 2\delta/r} \tag{2) 53}
$$

with  $\sigma_0$  the surface tension of the planar interface, and  $\delta$  the so- 54 called Tolman length,<sup>15</sup> which assumes a characteristic value for 55 every fluid. The com[bin](#page-5-0)ation of eqs 1 and 2 can in principle <sup>56</sup> yield the dependence on radius of the vapor pressure. <sup>57</sup> Nevertheless, as the diameter of the droplet approaches the <sup>58</sup> nanometer scale, the validity of these expressions derived from <sup>59</sup> classical thermodynamics becomes questionable. There has not <sup>60</sup> been a general agreement regarding the limit of applicability of <sup>61</sup> these equations. On the basis of thermodynamic arguments or 62 numerical simulations, or even based on indirect experimental <sup>63</sup> evidence, different authors, including Tolman himself, have <sup>64</sup> situated it in disparate lengths, from only a few Å ngströms to  $\epsilon$ s some tens of nanometers.  $57,16-25$  This limit has been explored 66 using Lennard-Jones p[otent](#page-5-0)i[als](#page-5-0) and molecular dynamics <sup>67</sup>  $s = 6$  7.17−[19,22](#page-5-0) The  $\frac{1}{2}$  The  $\frac{1}{2}$  The  $\frac{1}{2}$  The  $\frac{1}{2}$  The  $\frac{1}{2}$ 

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 vapor pressures computed using this route exhibit large uncertainties, due to the small number of particles in the 71 vapor phase and to the infrequent collisions in the vapor.<sup>17,18</sup> Different approaches based on Monte Carlo simulations [have](#page-5-0) been also applied to investigate this limit in the context of CNT, reporting that the deviations from the classical theory occur in a size range that goes from only four up to sixteen molecular diameters, depending on the interaction potential, the temperature, and the methodology.23−<sup>25</sup> Many studies have focused on the nucleation of small li[quid](#page-5-0) [d](#page-5-0)roplets, aiming to estimate size distributions and the formation free energies of Lennard-Jones and water clusters as a function of temperature and supersaturation.26−<sup>30</sup> Zhukhovitskii devised a grand canonical molecular [dynam](#page-5-0)ics scheme to identify the critical 83 cluster size of argon for different T−P conditions.<sup>26</sup> To tackle the same problem, Kusaka and collaborators later [p](#page-5-0)roposed a coarse graining of the total volume in small compartments containing in average no more than one molecule or aggregate, with which they circumvented the issue of an arbitrary cluster 88 definition.<sup>27</sup> Equilibrium distributions and free energies were evaluated [in](#page-5-0) the grand canonical ensemble from the probability of finding a cluster of a given size in the coarse-grained volume. Soon after, this method was generalized by incorporating umbrella sampling and the potential energy as an order parameter, allowing to characterize the free energy surface of argon in terms of the number of particles and the energy of the 95 aggregate.<sup>28</sup> Oh and Zeng implemented a canonical Monte Carlo me[th](#page-5-0)odology where a restriction was imposed on the 97 maximum number of particles that a cluster can attain.<sup>30</sup> This strategy allows to sample a metastable situation that ot[he](#page-5-0)rwise could not be observed, and was employed to determine the critical size and the formation free energy of argon clusters. A rather complete overview on theoretical and simulation aspects of the interfacial properties of nanoscopic liquid drops was 103 recently offered in a topical review by Malijevský and Jackson.<sup>31</sup> In this article, we employ a simple grand canonical screeni[ng](#page-5-0)  $105 \text{ (GCS)}$  approach<sup>32</sup> to calculate the vapor pressure of water droplets in the r[ang](#page-6-0)e 1−4 nm diameter. This methodology, in combination with first-principles DFT molecular dynamics, allows us to assess the applicability and the limitations of the Kelvin equation, and to analyze at the molecular level the cause of its divergence with respect to the molecular description.

# II. METHODOLOGY

 **A. Water Model.** The mW coarse-grained model of water<sup>33</sup> was employed to complete the large number of grand canoni[cal](#page-6-0) molecular dynamics simulations necessary to obtain the vapor pressure curves reported in the next section. The mW potential reproduces the energetics, density, and structure of liquid and solid water and its phase transitions, with comparable or better accuracy than most atomistic models, at nearly 1% of the 118 computational cost.<sup>33</sup> This model represents each molecule as a single particle int[era](#page-6-0)cting through anisotropic short-ranged potentials that encourage "hydrogen-bonded" water structures. It adopts the short-ranged interaction form of the Stillinger- Weber force-field, which consists of a sum of two-body attraction terms favoring high coordination, and three-body repulsion terms reinforcing tetrahedral hydrogen-bonded 125 configurations.<sup>33</sup> In recent years, the mW model has been repeatedly ap[plie](#page-6-0)d to explain the behavior of water in various conditions and regimes (see for example ref [34](#page-6-0) and references therein).

B. Molecular Dynamics Simulations. In this study, 129 molecular dynamics simulations were performed in the <sup>130</sup> canonical and grand canonical ensemble. Grand canonical <sup>131</sup> molecular dynamics (GCMD) schemes introduce Metropolis <sup>132</sup> Monte Carlo sampling throughout the dynamical evolution to <sup>133</sup> allow for particle exchange with a reservoir, hence preserving a <sup>134</sup> temporal description at a controlled chemical potential. The <sup>135</sup> movement of the particles is ruled by the integration of the <sup>136</sup> Newton equations using the Verlet algorithm at constant <sup>137</sup> temperature, which is controlled with the Nosé-Hoover 138 thermostat. Insertion and deletion attempts are effected on <sup>139</sup> single particles with equal probability and anywhere in the box, <sup>140</sup> adopting the usual acceptance criteria of the Monte Carlo <sup>141</sup> grand-canonical algorithm and assuming the vapor is an ideal <sup>142</sup> gas.<sup>35,36</sup> Along the grand canonical dynamics, a number of 143 att[empts](#page-6-0) for particle insertion and deletion are carried at every <sup>144</sup> time-step: this number is the so-called GC/MD ratio. It is <sup>145</sup> desirable to keep this parameter as low as possible to minimize <sup>146</sup> computer time, but in turn it must be high enough to ensure <sup>147</sup> that the target chemical potential is reached during the <sup>148</sup> simulation.<sup>37,38</sup> GC/MD ratios in the range 20-100 have 149 been typic[ally](#page-6-0) [u](#page-6-0)sed in previous studies.<sup>37–39</sup> In our simulations 150 a GC/MD ratio of 20 was adopted, [which](#page-6-0) is common in the <sup>151</sup> literature and gives converged results for the systems examined <sup>152</sup> here. GCMD simulations were performed using a properly <sup>153</sup> modified version of the LAMMPS program.<sup>40</sup>

Classical and first-principles molecular [dyn](#page-6-0)amics of water <sup>155</sup> were performed to construct the density maps and density <sup>156</sup> profiles. Classical molecular dynamics were realized using the <sup>157</sup> LAMMPS program, with the same time-step as employed in the <sup>158</sup> GCMD simulations, equal to 5 fs. On the other hand, first- <sup>159</sup> principles dynamics were based on density functional theory <sup>160</sup> and the Car−Parrinello method,<sup>41</sup> as implemented in the public 161 package Quantum-Espresso.<sup>42</sup> [T](#page-6-0)hese simulations were per- 162 formed in the microcanoni[cal](#page-6-0) ensemble using a time-step of <sup>163</sup> 0.19 fs, adopting the PW91 exchange-correlation func- <sup>164</sup> tional, $43,44$  Vanderbilt ultrasoft pseudopotentials, $45$  and a cutoff 165 of 25 [Ry](#page-6-0) [o](#page-6-0)n the plane-waves basis set. 166

C. Calculation of the Vapor Pressure: the GCS <sup>167</sup> Approach. The grand canonical screening procedure to 168 compute the vapor pressure is described in detail in reference. $32$  169 In the following, we give a brief overview of the techniq[ue.](#page-6-0) <sup>170</sup> According to classical nucleation theory,<sup>14</sup> for a given  $171$ supersaturation or chemical potential  $\mu$ , a cr[itic](#page-5-0)al cluster size 172  $N^*$  exists involving a saddle point in the free energy surface. 173 The vapor pressure of such a cluster is related to this chemical <sup>174</sup> potential by  $\mu_{eq} = \mu^{\theta} + RT \ln(P_v/P_{\theta})$ . In the present approach, 175 to determine  $P_{v}$  for a nanodroplet of size N, independent grand 176 canonical simulations must be conducted, each one at a <sup>177</sup> different chemical potential. As the simulation evolves, the total <sup>178</sup> number of molecules may rise or drop, depending on whether <sup>179</sup> the magnitude of  $\mu$  is, respectively, above or below the 180 equilibrium value  $\mu_{eq}$  associated with that N. For example, if the 181 value of  $\mu$  fixed in the simulation is above the value of  $\mu_{eq}$  182 corresponding to the initial curvature of the interface <sup>183</sup> (determined by  $N$ ), condensation occurs leading to an increase 184 in radius, which in turn diminishes the magnitude of  $\mu_{eq}$ . In this 185 way  $\mu_{ea}$  experiences a gradual decrease, moving away from  $\mu$ , 186 and thus the growth of the droplet continues until the <sup>187</sup> simulation box is completely filled. Conversely, if  $\mu$  is below  $\mu_{eq}$  188 at the beginning of the simulation, the evaporation proceeds <sup>189</sup> until all particles have disappeared. By repeating this computa- <sup>190</sup> tional experiment for a given  $N$  at different chemical potentials,  $191$ 

192 an upper and a lower bound can be established for  $\mu_{eq}$ . The 193 uncertainty in  $P_v$  is then determined by the lower and upper 194 values of  $\mu$  producing, respectively, the condensation and <sup>195</sup> evaporation of the droplet. It must be noted, though, that as the 196 chemical potential gets closer to  $\mu_{\text{eq}}$  the ratio between particles <sup>197</sup> insertion and deletion tends to 1, implying that longer <sup>198</sup> simulations are required to discern between evaporation and <sup>199</sup> condensation. The error can hence be reduced at the expense <sup>200</sup> of computational time.[32](#page-6-0)

 In the case of very small clusters in the vicinity of the equilibrium pressure, namely below 50 particles, the final evaporation or condensation behavior is not uniquely determined by the chemical potential but may depend on "hidden variables" as the initial structure of the cluster, the sequence of random numbers in the Monte Carlo run, or the assignment of initial velocities from the Boltzmann distribution. In other words, at the same chemical potential, two independent trajectories corresponding to nanodroplets of the same size might evolve distinctly to evaporation or to condensation. This ambiguous behavior is only observed for small N and follows from the fact that the stochastic components of the computational experiment become more important as the number of particles decreases. This is not a serious problem as far as it is recognized and can be handled by performing for each value of the chemical potential, a set of several short trajectories, each one based on a different sequence of random numbers or departing from different 219 initial configurations and velocities. In particular,  $\mu_{eq}$  is chosen as the value originating evaporation and condensation trajectories with equal probability. The error bar for that data-point can be similarly estimated on the basis of condensation and evaporation probabilities. Here, 10 trajecto-224 ries were performed for each data-point for  $N \leq 94$ , with the 225 exception of  $N = 9$  at the two highest temperatures, for which 25 trajectories were considered. The lower bound for the uncertainty was chosen as the pressure for which the number of trajectories leading to condensation was larger than 20%. Similarly, the upper bound was given by the pressure above which the evaporation probability (or, equivalently, the number of trajectories producing evaporation) was less than 20%. Further details on the computation of the errors can be found in the supporting material.

 We have shown in ref 32 that the GCS procedure described above reproduces the va[por](#page-6-0) pressure of bulk water and argon with a slightly better precision than the Gibbs-ensemble approach. Moreover, we have computed the relative vapor pressure for water aggregates of size ∼2 nm using both the mW and the SPC/E models to find that the two force-fields lead to the same results[.](#page-6-0)<sup>32</sup>

#### III. RESULTS AND DISCUSSION

 We applied the GCS procedure to determine the vapor pressure of water aggregates of different sizes, from only 9 f1 243 molecules up to 960. Figure 1 presents the logarithm of the relative vapor pressure obtained from GCMD simulations with the mW model at three temperatures as a function of the inverse radius, compared with the results given by the Kelvin 247 equation. This data is also summarized in Table 1. Strikingly, the thermodynamic formula reproduces the si[mu](#page-3-0)lations for radii as small as 7 Å with discrepancies below 5% at 278 K, and even smaller for higher temperatures. For 298 and 318 K, the Kelvin equation predicts the vapor pressure of water aggregates



Figure 1. Logarithm of the relative vapor pressure of water nanodroplets as a function of the inverse radius. Blue circles: grand canonical screening results. The dashed and dotted lines show the predictions of the Kelvin equation for different Tolman lengths. Black:  $\sigma = \sigma_0$  ( $\delta = 0$ ). Orange:  $\delta = -0.5$  Å. Red:  $\delta = 0.5$  Å. Green:  $\delta = 1.0$  Å.

with extraordinary accuracy all the way down to systems <sup>252</sup> composed of just 37 molecules, or nearly 1.2 nm of diameter. <sup>253</sup>

The approximation shows discrepancies of up to 20%, <sup>254</sup> depending on temperature, for the cluster of 20 particles, and <sup>255</sup> definitely breaks for the one of 9 molecules, which exhibits <sup>256</sup> strong negative deviations for all three temperatures. <sup>257</sup>

The magnitude and even the sign of the Tolman length  $(\delta)$  258 appearing in eq 2 has for long been a matter of debate, but <sup>259</sup> there is agreem[en](#page-0-0)t that it must be of the order of the <sup>260</sup> intermolecular distances.<sup>15,31,46−55</sup> For water, the value 261 originally proposed by [Tolm](#page-5-0)[an](#page-6-0) [w](#page-6-0)as  $1 \text{ \AA}^{15}$  with many 262 subsequent estimations from theory and si[mul](#page-5-0)ations falling <sup>263</sup> close to this former appraisal.<sup>48−52</sup> The validity of these 264 estimations has nevertheless be[en](#page-6-0) [di](#page-6-0)sputed by a number of <sup>265</sup> studies claiming that the surface tension must increase with <sup>266</sup> curvature (which implies  $\delta$  < 0),<sup>47,54,55</sup> with a recent work 267 based on molecular dynamics si[mulatio](#page-6-0)ns reporting for the <sup>268</sup> TIP4P/2005 water model a negative value of  $-0.56$  Å.<sup>56</sup> On 269 the other hand, the assess[me](#page-6-0)nt of  $\delta$  on the basis of experimental 270 data typically involves a number of assumptions and is <sup>271</sup> technically challenging, and this explains why consensus has <sup>272</sup> not been met either among experimentalists, who reported <sup>273</sup> Tolman lengths for water ranging from -0.47 to +0.6 Å.<sup>57,58</sup> 274 Whereas the curvature dependence of the surface tension [and](#page-6-0) <sup>275</sup> the sign of the Tolman length remain controversial, there is <sup>276</sup> general agreement on the following: it must be very small in <sup>277</sup> magnitude, it depends on droplet size and temperature <sup>278</sup> (presumably decreasing with  $T$ ), and its physical meaning is  $279$ lost when going to very small systems, in the order of a few <sup>280</sup> molecular diameters.  $31,51,53$  In this context, it is remarkable that 281 the Kelvin equation [m](#page-5-0)[atche](#page-6-0)s our data with a Tolman length of <sup>282</sup> approximately zero until the cluster size reaches about 4 <sup>283</sup> molecular diameters, with an abrupt failure below that range. <sup>284</sup>

Such a good performance of the thermodynamic formulation <sup>285</sup> to describe these small objects may seem unexpected. In fact, <sup>286</sup> the Kelvin equation turns out to be valid in a region where the <sup>287</sup> inhomogeneities in the density of matter occur within spatial <sup>288</sup> lengths of the same order of magnitude as the size of the <sup>289</sup> aggregate, whereas among the major assumptions underlying <sup>290</sup> the thermodynamic treatment, there are (i) the homogeneity of <sup>291</sup> the surface and the continuous nature of the fluid, (ii) a <sup>292</sup> constant density inside the droplet, independent from radius, <sup>293</sup> and (iii) the sphericity of the aggregate. Clearly, these <sup>294</sup> requirements do not hold for the instantaneous configurations <sup>295</sup> of clusters consisting of less than a few hundred molecules, as 296 f2 <span id="page-3-0"></span>Table 1. Relative Vapor Pressures  $(P_v/P_0)$  and Radii  $(r, in \AA)$  for Different Water Droplets Composed by N Molecules<sup>a</sup>



a<br>Absolute errors are given in parentheses. The values of  $P_0$  for the mW model at 278, 298, and 318 K, are, respectively, 0.13 mbar, 0.49 mbar and 1.50 mbar.

f2 297 can be seen in Figure 2, and as reflected in the nonequal <sup>298</sup> eigenvalues of the moment of inertia tensor, presented in the



Figure 2. Instantaneous configurations of water clusters of different sizes, randomly selected from the molecular dynamics simulations at 298 K. The shape deviation from sphericity is significant for systems with less than 150 particles.

 Supporting Information. Interestingly, however, they do hold [for the temporal average](#page-5-0)s of their trajectories, displayed in the f3 301 density maps of Figure 3. Since the thermodynamic properties are manifestations of the behavior averaged in the macroscopic time-scale, it can be argued that the master equations remain valid for those systems in which the dynamics smoothes down the discrete, inhomogeneous structure of the nanoaggregate. f4 306 Figures 3 and 4 show that droplets of 1.2 nm diameter or larger reasonably fit into this premise: they all exhibit a spherical shape and a constant density along the most part of the 309 condensed phase, equal to 0.033 Å<sup>-3</sup>, which is the density of bulk water. Smaller droplets depart from this paradigm: the averaged density is not homogeneous, but presents a peak on the boundary, while the sphericity is lost in shorter time lengths. Coincidentally, the agreement between the Kelvin equation and the simulations deteriorates at the same point



Figure 4. Time-averaged radial density profiles of water droplets of different sizes at 298 K. The averaging was performed on NVT molecular dynamics trajectories extended for at least 3 ns.

where the averaged density profile of the cluster starts to <sup>315</sup> become strongly inhomogeneous. 316

The effect of rotations on the density distributions were <sup>317</sup> checked by aligning the eigenvectors of the moment of inertia <sup>318</sup> tensors at each step of the molecular trajectories. No <sup>319</sup> appreciable differences were found when rotation was taken <sup>320</sup> into account, presumably because the liquid-like nature of these <sup>321</sup> clusters at room temperature produces continuous deforma- <sup>322</sup> tions in which the rotational and the internal degrees of <sup>323</sup> freedom are too much coupled. The particular density <sup>324</sup> distribution observed for the smallest clusters has been <sup>325</sup> corroborated in the case of the 9 molecules aggregate by <sup>326</sup> means of ab initio molecular dynamics simulations (Figure [5\)](#page-4-0), 327 f5



Fi<mark>gure 3.</mark> Bidimensional density maps of water droplets of different sizes at 298 K. Units for the color scale bar are Å<sup>−3</sup>. The densities were averaged over time-windows of 100 ns for the smaller systems and 3 ns for the largest.

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Figure 5. Same as Figure 3, obtained for the droplet of 9 molecules from ab initio molecul[ar](#page-3-0) dynamics. The nonuniform density distribution is due to an insufficient averaging time of 20 ps.

<sup>328</sup> which show that it is not an artifact of the mW potential. The <sup>329</sup> agreement between the classical and the DFT ab initio <sup>330</sup> calculations stems from the fact that both the mW and the f6 331 DFT dynamics explore the same minima in phase space. Figure f6 332 6 presents some representative instantaneous configurations



Figure 6. Different configurations of a cluster of 9 water molecules, taken from quantum (A) and classical (B) molecular dynamics simulations, based on DFT and on the mW model, respectively. For the sake of comparison, only the oxygen atoms are depicted. Bars are indicative of two atoms lying at less than 3.4 Å, which is the distance between two water molecules forming an H-bond. The first image of the series predominates along the dynamics in both approaches.

 extracted from the classical and the quantum dynamics. Both approaches produce the same structures, typically showing a molecule in each one of the eight corners of a cube, plus a ninth molecule off an edge. These geometries turn out to be coincidental with the ab initio minimum energy configurations of the cluster of 9 water molecules reported in the literature.59,60 Therefore, we would not expect a substantial improve[ment](#page-6-0) if the mW potential were to be replaced by an atomistic or even a quantum-mechanical treatment: the resulting vapor pressure is ultimately determined by the magnitude of the intermolecular interactions, which classical water force-fields are fitted to reproduce pretty accurately, sometimes even better than obtained via first-principles simulations (for example, within DFT-GGA the solid−liquid 347 transition temperature in water is off by around 140  $K^{01}$ ).

 Estimates to the vapor pressure of water nanodroplets can be obtained from the literature related to classical nucleation theory. Kusaka and collaborators applied a grand canonical methodology to evaluate equilibrium distributions and free 352 energies of  $SPC/E$  water.<sup>27</sup> The maxima in the free energy 353 curves of Figure 7 gives [t](#page-5-0)he critical cluster sizes, $27$  in fair

agreement with our own results. For example, for a super- <sup>354</sup> saturation  $P/P_0 \approx 5$  at 298 K the critical cluster has 355 approximately 35 molecules, whereas for the same temperature <sup>356</sup> we find  $P_v/P_0 = 4.39$  for an aggregate of 37 mW molecules 357 (Table 1). The critical sizes are slightly overestimated in <sup>358</sup> Kusaka'[s](#page-3-0) method with respect to our approach, this over- <sup>359</sup> estimation becoming more notorious for higher supersatura- <sup>360</sup> tions. The small discrepancies are attributable to the different <sup>361</sup> methodologies and, to a lesser extent, to the distinct potentials <sup>362</sup> (in previous work $32$  we showed that both the SPC/E and the 363 mW models give [v](#page-6-0)ery similar relative vapor pressures for a <sup>364</sup> cluster of 94 molecules). The dynamical nucleation theory by <sup>365</sup> Schenter et al. provides a different route to the vapor pressure 366 of water clusters, based on the ratio between the evaporation <sup>367</sup> and the condensation rates.  $62,63$  Figure [3](#page-3-0) of ref 62 shows for P/ 368  $P_0$  = 10 that the rate const[ants](#page-6-0)  $\alpha_i$  and  $\beta_{i-1}$  reac[h th](#page-6-0)e same value 369 for droplets of slightly above 40 molecules. The GCS procedure <sup>370</sup> predicts a  $P/P_0$  ratio close to 5.2 for clusters of this size at 278 371 K. The classical Kelvin equation, in turn, gives a relative vapor <sup>372</sup> pressure of nearly 5.6, meaning that while our approach yields <sup>373</sup> negative deviations from the Kelvin equation, the dynamical <sup>374</sup> nucleation theory technique would show positive deviations. <sup>375</sup> Part of this disagreement might be ascribed to differences in <sup>376</sup> temperature and force fields: simulations in ref 62 have been <sup>377</sup> performed at 243 K with a polarizable water [mod](#page-6-0)el. Beyond <sup>378</sup> this particular result, it must be noticed that methods based on <sup>379</sup> CNT are designed to predict the evaporation and condensation <sup>380</sup> rates for a distribution of nanoaggregates of different sizes in <sup>381</sup> dynamical equilibrium. Our approach, instead, considers a <sup>382</sup> single droplet (or interface) in equilibrium with the vapor <sup>383</sup> phase, but isolated from any other cluster or interface. This is <sup>384</sup> the same situation described by the Kelvin equation, which may <sup>385</sup> explain why it shows a closer agreement with our results. A full <sup>386</sup> accord between the two methodologies should then not be <sup>387</sup> expected. The dynamical nucleation theory is a more powerful <sup>388</sup> approach since it gives information on a full distribution of <sup>389</sup> clusters. Moreover, CNT schemes provide evaporation and <sup>390</sup> condensation rates, which in GCMD would require a careful <sup>391</sup> validation to ensure that time-evolution is quantitatively <sup>392</sup> realistic. On the other hand, dynamical CNT techniques rely <sup>393</sup> on more assumptions and parameters than our approximation, <sup>394</sup> which depends only on the force-field, and therefore we expect <sup>395</sup> it to be more accurate to predict the relative vapor pressure of <sup>396</sup> an isolated nanodroplet. In those CNT applications where, at <sup>397</sup> variance with dynamical nucleation theory, aggregates are <sup>398</sup> envisioned as independent entities in the vapor phase, with no <sup>399</sup> connection with clusters of other sizes, the framework of a <sup>400</sup> dynamical exchange of particles between a distribution of <sup>401</sup> droplets of different sizes is lost, and the critical cluster size for <sup>402</sup> a given supersaturation has to be consistent with the one <sup>403</sup> predicted from our analysis. Possibly, the present treatment <sup>404</sup> may be used in a complementary way to classical nucleation <sup>405</sup> theory methods, by providing values for the vapor pressures of <sup>406</sup> clusters that can be exploited in larger-scale models.

Our approach to the vapor pressure of clusters is <sup>408</sup> conceptually analogous to the one followed by Zhukhovitskii <sup>409</sup> to estimate critical sizes. $26$  In that work, a grand canonical 410 molecular dynamics sche[me](#page-5-0) was proposed where the insertion <sup>411</sup> of molecules takes place at random positions on the system <sup>412</sup> boundary with velocities chosen from the Maxwell−Boltzmann <sup>413</sup> distribution, removing at the same time any molecule coming <sup>414</sup> from the simulation cell and traveling across this boundary.<sup>26</sup> In  $415$ this way, the algorithm reproduces a vapor environ[me](#page-5-0)nt <sup>416</sup> <span id="page-5-0"></span> corresponding to a desired temperature and pressure. To identify the critical cluster size for different conditions, the number of particles N was monitored as a function of time at a fixed pressure and temperature, starting from different cluster sizes. Two possibilities were observed for these trajectories: evaporation or condensation, meaning respectively that the initial size was below or above the critical value. This behavior is analogous to the one observed in the GCS simulations, with the only distinction that in our work different chemical potentials were screened for a given initial size to determine the vapor pressure, whereas Zhukhovitskii screened different initial values of N for a fixed pressure to obtain the critical size. Nevertheless, the two approaches are equivalent and provide access to the same information, i.e., the size of the metastable cluster associated with a given vapor pressure. The molecular dynamics method proposed in ref 26 is likely to be better suited to examine weakly interacting fluids as the Lennard-Jones model, for which small clusters are difficult to stabilize in a more conventional grand canonical framework. On the other hand, our approach seems more appropriate for systems exhibiting a low vapor pressure as water, where the application of Zhukhovitskii's scheme would require very large simulation cells and long sampling times to ensure a reasonable exchange of particles in the vapor phase that provides a converged statistics.

# IV. FINAL REMARKS

 In summary, we have determined the vapor pressure of water nanodroplets from 9 to 960 molecules. The results led us to conclude that the Kelvin equation is valid as far as the temporally averaged density of the water droplets exhibit a homogeneous profile, which establishes a link between time and the basic assumptions behind any thermodynamic approach. This is in fact the case for droplets as small as 0.6 nm radius at 278 K or even smaller at higher temperatures. For water, this implies a radius of only two molecular diameters, which is much smaller than the limit of around 10 molecular diameters for which the capillary approximation is considered to be valid in the literature.<sup>31</sup> A question remains on the universality of the present conclusions, specially their connotation for other nanosystems exhibiting different structure and interactions strength. This topic will be the subject of future investigations.

# <sup>458</sup> ■ ASSOCIATED CONTENT

#### 459 Supporting Information

 Plots of the pressure-dependent evolution of the number of molecules as a function of simulation step for clusters of 94, 37, and 9 molecules; the eigenvalues of the moment of inertia tensor for various clusters; the definition of the nanodroplet radii; details on cell size and starting configurations, and on the calculation of the error for small clusters. This material is available free of charge via the Internet at [http://pubs.acs.org.](http://pubs.acs.org)

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- 470 Notes
- <sup>471</sup> The authors declare no competing financial interest.

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