

Original citation:

Fitzner, Martin, Joly, Laurent, Ma, Ming, Sosso, Gabriele C., Zen, Andrea and Michaelides, Angelos. (2017) Communication : truncated non-bonded potentials can yield unphysical behavior in molecular dynamics simulations of interfaces. The Journal of Chemical Physics, 147 (12). 121102.

Permanent WRAP URL:

http://wrap.warwick.ac.uk/929002

Copyright and reuse:

The Warwick Research Archive Portal (WRAP) makes this work by researchers of the University of Warwick available open access under the following conditions. Copyright © and all moral rights to the version of the paper presented here belong to the individual author(s) and/or other copyright owners. To the extent reasonable and practicable the material made available in WRAP has been checked for eligibility before being made available.

Copies of full items can be used for personal research or study, educational, or not-for-profit purposes without prior permission or charge. Provided that the authors, title and full bibliographic details are credited, a hyperlink and/or URL is given for the original metadata page and the content is not changed in any way.

Publisher's statement: This article may be downloaded for personal use only. Any other use requires prior permission of the author and AIP Publishing. The following article has been submitted to/accepted by Journal of Chemical Physics. After it is published, it will be found at http://aip.scitation.org/journal/jcp

A note on versions:

The version presented here may differ from the published version or, version of record, if you wish to cite this item you are advised to consult the publisher's version. Please see the 'permanent WRAP URL' above for details on accessing the published version and note that access may require a subscription.

For more information, please contact the WRAP Team at: wrap@warwick.ac.uk

Publishinginmunication: Truncated Non-Bonded Potentials Can Yield Unphysical

² Behavior in Molecular Dynamics Simulations of Interfaces

- Martin Fitzner,¹ Laurent Joly,² Ming Ma,³ Gabriele C. Sosso,¹ Andrea Zen,¹ and
- Angelos Michaelides^{1, a)}
- ⁵ ¹⁾ Thomas Young Centre, London Centre for Nanotechnology and
- 6 Department of Physics and Astronomy, University College London,
- 7 Gower Street London WC1E 6BT, United Kingdom
- ⁸ ²⁾ Univ Lyon, Université Claude Bernard Lyon 1, CNRS, Institut Lumière Matière,
- 9 F-69622 Villeurbanne, France
- ³⁾Department of Mechanical Engineering, State Key Laboratory of Tribology and
- ¹¹ Center for Nano and Micro Mechanics, Tsinghua University, Beijing 100084,
- 12 China

13 (Dated: 15 September 2017)

Non-bonded potentials are included in most force fields and therefore widely used in classical molecular dynamics (MD) simulations of materials and interfacial phenomena. It is commonplace to truncate these potentials for computational efficiency based on the assumption that errors are negligible for reasonable cutoffs or compensated for by adjusting other interaction parameters. Arising from a metadynamics study of the wetting transition of water on a solid substrate we find that the influence of the cutoff is unexpectedly strong and can change the character of the wetting transition from continuous to first order by creating artificial metastable wetting states. Common cutoff corrections such as the use of a force switching function, a shifted potential or a shifted force do not avoid this. Such a qualitative difference urges caution and suggests that using truncated non-bonded potentials can induce unphysical behavior that cannot be fully accounted for by adjusting other interaction parameters.

14

Keywords: Molecular Dynamics, Interfaces, Force Fields, Free Energy

^{a)}Electronic mail: angelos.michaelides@ucl.ac.uk



PublishingShort- to medium-range potentials such as the Lennard-Jones¹ or the Buckingham² po-¹⁶ tential are the backbone of classical MD simulations. They represent Pauli repulsion as ¹⁷ well as non-directional dispersion attraction and there exist multiple flavors implemented ¹⁸ in most MD codes under the term of non-bonded interactions. In practice there is a need ¹⁹ to truncate these potentials since the number of neighbors that have to be considered for 20 each entity grows enormously, drastically increasing the computational cost for the force ²¹ calculation. Truncating between $r_{\rm c} = 2.5$ and 3.5σ , where σ is the characteristic interaction ²² range, is a very common practice in MD studies³ and has become the minimum standard, ²³ assuming that errors arising from this are small enough. Several studies have reported that ²⁴ with these settings significant problems can arise. For instance the truncation can alter ²⁵ the phase diagram of the Lennard-Jones system^{4,5} or yield different values for interfacial $_{26}$ free energies⁶⁻¹⁰. These effects are quantitative in nature, meaning that they can in certain $_{27}$ circumstances be analytically corrected for $^{11-13}$ or compensated for by other interaction pa-²⁸ rameters such as interaction strength or interaction range. The latter is important for the 29 development of force fields where non-bonded potentials are often included and the cutoff ³⁰ can be seen as another fitting parameter. Naturally, a parametrization with a small cutoff ³¹ would be preferred to another one if they deliver equal accuracy. This however is only true ³² in the assumption that the underlying physical characteristics that are created by truncated 38 and longer ranging potentials are the same.

In this work we investigated the influence of the cutoff for the interfacial phenomenon of water-wetting on a solid substrate. We found that the effect of the cutoff of the watersubstrate interaction was not only unexpectedly strong, but also changed the fundamental physics of the wetting transition in an unprecedented way by creating metastable wetting states that have also never been seen in experiments. We show that proposed cutoff corrections such as the use of a force switching function, a shifted potential or a shifted force did a not fix this and could even worsen the effect. This finding shows that atomistic simulations of interfaces need to be treated with great care since unphysical behavior could occur and a easily remain undetected. This is particularly relevant since a large number of MD studies using truncated potentials are reported each year. Our results suggest the use of much a larger-than-common cutoffs or long-range versions of non-bonded potentials in MD studies of wetting and interfacial phenomena.

48 We investigated two droplets comprised of 3000 and 18000 water molecules which were





FIG. 1. a) Side view of the two wetting states for the small droplet. Water is blue and surface atoms are gray. b) Temperature of the wetting transition $T_{\rm w}$ (points) versus cutoff radius $r_{\rm c}$ and fit (red line). The $T_{\rm w}$ were obtained from the free energy profiles (see text) and we estimate errors to be ± 3 K. T_0 is the converged wetting temperature.

⁴⁹ represented by the coarse-grained mW model¹⁴, on top of a rigid, pristine fcc(100) surface ⁵⁰ (lattice parameter 4.15 Å). Whilst this substrate does not aim at representing any partic-⁵¹ ular material, similar systems have been used to study ice nucleation^{15–18} or water-metal ⁵² interfaces^{19,20}. The simulation cell had dimensions $17 \times 17 \times 11 \text{ nm}^3$ which is enough to ⁵³ avoid interaction of the water molecules with their periodic images for all wetting states. ⁵⁴ Even though the liquid is rather non-volatile even at the highest temperature considered, ⁵⁵ we employed a reflective wall at the top of the cell to avoid evaporation and mimic experi-⁵⁶ mental conditions. Our simulations were performed with the LAMMPS code²¹, integrating ⁵⁷ the equations of motion with a timestep of 10 fs. This rather large timestep is commonly ⁵⁸ used in combination with the mW model and is acceptable for our system since during NVE ⁵⁹ simulations the total energy drift was found to be only about 2×10^{-9} eV per water molecule ⁶⁰ per ps. In addition, we verified that we obtain the same results using standard protocols for ⁶¹ updating the neighbor lists compared with unconditionally updating them every timestep. ⁶² All production simulations were performed in the NVT ensemble with constant tempera-⁶³ ture maintained by a ten-fold Nosé-Hoover chain²² with a relaxation time of 1 ps. The



FIG. 2. Free energy profiles of wetting for different cutoffs in a small temperature range around the respective transition temperature $T_{\rm w}$ (generally at or near the central column for each system). As collective variable we chose the center of mass of the water droplet (COM_z, substrate at z = 0). We note that for the largest cutoff of 8σ the temperature range is slightly larger to highlight the shape of the free energy profile for complete and partial wetting.

 $_{64}$ substrate-water interaction was given by a distance (r) dependent Lennard-Jones potential

$$U_{\rm LJ}(r) = 4\epsilon \left[\left(\frac{\sigma}{r}\right)^{12} - \left(\frac{\sigma}{r}\right)^6 \right] \tag{1}$$

⁶⁵ with $\epsilon = 29.5$ meV, $\sigma = 2.5$ Å truncated at a cutoff r_c . This resulted in a maximum ⁶⁶ interaction energy of 154 meV for an adsorbed water monomer (weakly depending on the ⁶⁷ cutoff). Additionally we performed well-tempered metadynamics simulations^{23,24} for the ⁶⁸ smaller droplet with the PLUMED2 code²⁵. In these simulations the Gaussian height, ⁶⁹ width, bias-factor and deposition stride were 2.16 meV, 0.15 Å, 20 and 20 ps respectively. ⁷⁰ Metadynamics is usually applied to drive rare events such as nucleation^{26–29} or protein ⁷¹ folding^{30,31}. In our systems, this method helped to uncover the underlying free energy ⁷² profile of wetting.

⁷³ We studied the wetting behavior of the larger droplet by performing standard MD runs ⁷⁴ at different temperatures first. As starting configurations we chose either a flat water film ⁷⁵ in direct contact or a spherical droplet placed above the substrate. Within at most 5 ns



Publishing simulation was equilibrated and a seemingly stable configuration was reached, where 77 the water is either wetting (contact angle $\theta = 0^{\circ}$) or partially wetting ($0^{\circ} < \theta < 180^{\circ}$). 78 An illustration of the two wetting states can be found in figure 1a. Initially we employed 79 a radial cutoff at $r_c = 3.0\sigma$ for the water-substrate interaction. With this setting we found 80 that interestingly a wetting transition happened at finite angle $\theta_0 \approx 23^{\circ}$, i.e. a smaller 81 non-zero contact angle was not possible. This behavior cannot be explained by the standard 82 Young's equation.

However, upon increasing the cutoff we found that the wetting behavior drastically 83 $_{s4}$ changed. First, the wetting temperature T_w at which the wetting transition took place $_{100}$ increased as we increased the cutoff (figure 1b). Whilst $T_{\rm w}$ shows a clear convergence behav- $_{so}$ ior with $r_{\rm c}$, it is unexpectedly slow. A reasonably converged wetting temperature T_0 is only $r_{\rm er}$ reached for $r_{\rm c} > 7\sigma$. Second, we noticed that for an increasing cutoff the minimum possible ⁸⁸ contact angle θ_0 got smaller and eventually vanished. Most importantly, we also found that $_{\rm so}$ for temperatures around $T_{\rm w}$ the stable configuration that was reached after the 5 ns could $_{90}$ depend on the starting configuration for smaller cutoffs, while for larger $r_{\rm c}$ it always reached $_{\rm 91}$ the same state. This suggests that for small $r_{\rm c}$ we actually found metastable wetting states $_{\rm 92}$ that are absent for large $r_{\rm c}.$ This also means that $T_{\rm w}$ cannot naively be defined through ⁹³ visual analysis of trajectories at different temperatures but needs to be defined by the free $_{94}$ energy of wetting. For a first order phase transition we define $T_{\rm w}$ to be the temperature ⁹⁵ where the two basins (corresponding to wetting and partial wetting) have the same free $_{96}$ energy. For a continuous phase transition $T_{\rm w}$ is the temperature where the single basin ⁹⁷ represents a contact angle of $\theta = 0^{\circ}$ for $T < T_{\rm w}$ and $\theta > 0^{\circ}$ for $T > T_{\rm w}$.

⁹⁸ Understanding the character of these wetting states with standard MD can prove difficult ⁹⁹ as the dependence on the starting configuration always leaves doubt on the outcome of ¹⁰⁰ the equilibrated configuration obtained from it. To clarify, we show the results from the ¹⁰¹ metadynamics simulations in figure 2. As a collective variable we chose the z-component of ¹⁰² the center of mass of the water droplet (COM_z), where z is the surface normal direction. ¹⁰³ While this choice is not equivalent to the contact angle (as they are related in a non-linear ¹⁰⁴ manner) it is clear that significantly different values for COM_z correspond to different contact ¹⁰⁵ angles and can therefore distinguish the different wetting states. For the smallest cutoff at ¹⁰⁶ T_w and around we found that two basins coexist, one being the flat film (COM_z ≈ 4 Å) ¹⁰⁷ and the other being a droplet with certain contact angle (COM_z $\gtrsim 5$ Å). These two states



Publishing separated by a significant barrier larger than 20 $k_{\rm B}T$, which explains why we observed ¹⁰⁹ metastable states in the unbiased simulations for small $r_{\rm c}$. This corresponds to a first-¹¹⁰ order phase transition between the wetting states. The occurrence of a minimum possible ¹¹¹ contact angle θ_0 is explained by the existence of the second basin, which does not approach ¹¹² the wetting basin, but rather becomes less stable as temperature changes. However, this ¹¹³ character faded as we increased $r_{\rm c}$. The barrier became smaller and the distance between ¹¹⁴ the basins got smaller. For the largest cutoff investigated (8σ) we clearly see that only a ¹¹⁵ single basin exists that changes its position with temperature. As a result no metastable ¹¹⁶ wetting states exist and the phase transition is continuous. We note that in this case the ¹¹⁷ estimate of $T_{\rm w}$ is more difficult than for the first order transitions, however in this work we ¹¹⁸ aim at presenting qualitative results and from figure 2 it is clear that $T_{\rm w}$ is higher than for ¹¹⁹ the smaller cutoffs.

Only the results for the largest cutoff are in agreement with the fact that water wetting transitions are generally continuous when probed in experiments^{32,33} and finite-angle wetting transitions have, to the best of our knowledge, never been observed experimentally. Therefore, the correct qualitative wetting behavior in our system is not achieved with standard transitions and if undetected could potentially lead to false conclusions. Differences between short and long-ranged interactions have been highlighted for other interfacial phenomena, such as drying³⁴ or grain boundary melting³⁵.

- ¹²⁸ We further study the effect of the most commonly used correction schemes to cutoffs:
 - 1. A shifted potential (sp) which ensures that the value of the potential energy U does not jump at the cutoff distance, given by:

$$U_{\rm sp}(r) = U_{\rm LJ}(r) - U_{\rm LJ}(r_{\rm c})$$
⁽²⁾

The corresponding force F remains unaltered:

$$F_{\rm sp}(r) = F_{\rm LJ}(r) \tag{3}$$

2. A switching function (switch) which brings the force to zero between an inner $r_{c,1}$ and an outer cutoff $r_{c,2}$ (we choose 3 and 4 σ):

$$F_{\text{switch}}(r) = F_{\text{LJ}}(r) \qquad r \le r_{\text{c},1}$$
(4)
$$F_{\text{switch}}(r) = \sum_{k=0}^{3} C_k (r - r_{\text{c},1})^k \qquad r_{\text{c},1} < r \le r_{\text{c},2}$$





FIG. 3. Free energy profiles of wetting approximately at the transition temperature with uncorrected setup (cut) and for different correction schemes [shifted potential (sp), force switch (switch) and shifted force (sf)] applied with a cutoff at 3σ . None of the schemes show the correct behavior, which is shown in figure 2 to be a single basin.

- where C_k are constants determined to ensure a smooth behavior²¹.
 - 3. A shifted-force potential (sf), which ensures that force and potential do not jump:

$$U_{\rm sf}(r) = U_{\rm LJ}(r) - U_{\rm LJ}(r_{\rm c}) - (r - r_{\rm c})F_{\rm LJ}(r_{\rm c})$$
(5)
$$F_{\rm sf}(r) = F_{\rm LJ}(r) - F_{\rm LJ}(r_{\rm c})$$

130 The latter approach was found to give good results for a homogeneous system and even allowed for a reduction of the cutoff³⁶. Our results for these three corrections can be found in 131 figure 3. Unsurprisingly the shifted potential does not yield any significant difference over the 132 plain cutoff since forces remain unaltered. The smooth cutoff via switching function seems 133 to improve the situation, however the fact that the transition temperature lies between the 134 ones we found for a plain cutoff at 3 and 4σ suggests that the improvement stems from the 135 effectively increased interaction range rather than the fact that the force vanishes smoothly. 136 Interestingly, the shifted force with the same cutoff performs worst out of all candidates as 137 ¹³⁸ the barrier increases by a factor of two, which increases the likelihood that simulations are ¹³⁹ performed in the metastable state without realizing it. The fact that none of the considered ¹⁴⁰ correction schemes significantly improved the character of the wetting free energy profile



Publishingd's us to conclude that it is not the way in which the cutting is done that matters most, 142 but rather the effective cutoff distance as well as the overall interaction strength at that 143 distance.

As an initial attempt to understand the results obtained we looked at the potential 144 145 energies of the various systems with the different cutoffs considered. This, however, did not reveal any obvious explanation. However, one possible interpretation for the creation 146 of metastable states in our systems with shorter cutoff can be obtained by considering 147 the droplet state (not assuming anything about the stability relative to the film state). 148 149 For a transition towards the film state, there needs to be thermal fluctuations of water molecules that are above the contact layer in the downwards direction (the fact that COM_z 150 ¹⁵¹ has proven a good reaction coordinate supports this statement). With an infinite interaction ¹⁵² range all molecules that are loosing height contribute to these fluctuations since they have an interaction with the substrate. Therefore we expect the interaction energy to change monotonically and the free energy to follow monotonically either up or down depending on the balance of the interfacial free energies (see figure 2, $r_c = 8\sigma$). But if the interaction range is finite, not all molecules contribute to an increased interaction with the substrate 156 even if they decrease their height (and subsequently weaken the water-water interaction 157 of the system by leading to deviations from a perfect spherical droplet). In other words, 158 there is a minimum distance from the substrate that has to be surpassed by a molecule 159 for it to contribute to a fluctuation increasing the interaction energy, otherwise it will (on 160 average) actually decrease the total interaction energy. This minimum fluctuation for a 161 single molecule translates into the macroscopic states (droplet and film) being connected by 162 a barrier shaped free energy profile rather than a monotonic one (see figure 2, $r_c = 3\sigma$). The 163 entropic contributions to the free energy are unlikely to change this, since they are essentially 164 dominated by the environment a molecule is in (quasi-static contact layer or quasi-liquid 165 water on top). The entropic change between these two states will be monotonic for a single 166 water molecule and therefore also for the whole droplet. 167

Finding a general recipe for how to avoid such unphysical wetting states is difficult. ¹⁶⁹ Other aspects like e.g. the substrate density or the liquid-liquid interaction strength will ¹⁷⁰ have an influence on how strongly the fluctuations in the droplet state are affected by r_c . ¹⁷¹ Generally, cutoffs that are deemed acceptable from the inter-molecular perspective do not ¹⁷² necessarily mean that the interaction between macroscopic states such as a film/droplet and



Publishing betrate is sufficiently captured. This is especially important in an interfacial simulation ¹⁷⁴ setting such as a slab, where a cutoff-caused change in interaction from the substrate side is ¹⁷⁵ not compensated by an equal change from the vacuum side. Consequently, only employing ¹⁷⁶ much larger cutoffs or techniques to calculate the long-range part of the dispersion force^{37–39} ¹⁷⁷ can ensure that unphysical effects are avoided. A minimal sanity check for future wetting ¹⁷⁸ studies could be to start simulations from both a wetting film and a spherical liquid snapshot. ¹⁷⁹ If both of them end up in the same configuration the existence of an unphysical metastable ¹⁸⁰ wetting state is unlikely.

In light of the vast amount of work that is done in the MD community using similar 181 ¹⁸² interactions, our findings urge extreme caution when dealing with truncated non-bonded 183 potentials in simulations of interfacial phenomena. We have seen both quantitative and qualitative differences for the wetting transition. The former could be accounted for by 184 changing other interaction parameters to reproduce the transition at the right temperature 185 T_0 . This assumption is fundamental to fitting force fields with truncated potentials to 186 187 obtain quantitative agreement with e.g. experimental values. But it does not hold for the character of the transition because it arises purely from the value of the cutoff itself. If 188 the resulting metastability of states remains undetected, the use of truncated interaction 189 ¹⁹⁰ potentials could lead to wrong inferences about physical properties being made. While ¹⁹¹ this conclusion has resulted from a simulation of wetting, similar implications could hold for other interfacial phenomena such as capillary $flow^{40,41}$, evaporation/condensation^{42,43}. ¹⁹³ mixtures^{44–46} or heterogeneous nucleation^{47–51} where it is commonplace to use truncated 194 interactions.

195 ACKNOWLEDGMENTS

This work was supported by the European Research Council under the European Union's Programme (FP/2007-2013) / ERC Grant Agreement number 616121 (Heterolce project). A.M. is supported by the Royal Society through a Royal Society Wolfson Research Merit Award. We are grateful for computational resources provided by the London Centre for Nanotechnology and the Materials Chemistry Consortium through the EPSRC grant number EP/L000202. L.J. is supported by the French Ministry of Defense through the project DGA ERE number 2013.60.0013 and by the LABEX iMUST (ANR-10-LABX-



Publishing 4) of Université de Lyon, within the program "Investissements d'Avenir" (ANR-11-IDEX-

²⁰⁴ 0007) operated by the French National Research Agency (ANR). M.M. is supported by the ²⁰⁵ Thousand Young Talent Program from the Organization Department of the CPC Central

²⁰⁶ Committee.

207 REFERENCES



- ²⁰⁸ ¹J. E. Jones, in *Proc. R. Soc. A*, Vol. 106 (The Royal Society, 1924) pp. 463–477.
- ²⁰⁹ ²R. A. Buckingham, in *Proc. R. Soc. A*, Vol. 168 (The Royal Society, 1938) pp. 264–283.
- ²¹⁰ ³D. Frenkel and B. Smit, Understanding Molecular Simulation: From Algorithms to Appli-
- ²¹¹ cations, Vol. 1 (Academic press, 2001).
- ²¹² ⁴B. Smit, J. Chem. Phys. **96**, 8639 (1992).
- ²¹³ ⁵Z.-J. Wang, C. Valeriani, and D. Frenkel, J. Phys. Chem. B **113**, 3776 (2008).
- ⁶A. E. Ismail, M. Tsige, P. J. Veld In't, and G. S. Grest, Mol. Phys. **105**, 3155 (2007).
- ²¹⁵ ⁷C. Valeriani, Z.-J. Wang, and D. Frenkel, Mol. Sim. **33**, 1023 (2007).
- ²¹⁶ ⁸A. Ghoufi, P. Malfreyt, and D. J. Tildesley, Chem. Soc. Rev. 45, 1387 (2016).
- ²¹⁷ ⁹A. Ghoufi and P. Malfreyt, J. Chem. Phys. **146**, 084703 (2017).
- ²¹⁸ ¹⁰M. Sega and C. Dellago, J. Phys. Chem. B **121**, 3798 (2017).
- ²¹⁹ ¹¹H. Sun, J. Phys. Chem. B **102**, 7338 (1998).
- ²²⁰ ¹²S. Sinha, V. K. Dhir, B. Shi, J. B. Freund, and E. Darve, in ASME 2003 Heat Transfer
- ²²¹ Summer Conference (American Society of Mechanical Engineers, 2003) pp. 711–714.
- ²²² ¹³S. Werth, M. Horsch, and H. Hasse, Mol. Phys. **113**, 3750 (2015).
- ²²³ ¹⁴V. Molinero and E. B. Moore, J. Phys. Chem. B **113**, 4008 (2009).
- ²²⁴ ¹⁵A. Reinhardt and J. P. Doye, J. Chem. Phys. **136**, 054501 (2012).
- ²²⁵ ¹⁶S. J. Cox, S. M. Kathmann, B. Slater, and A. Michaelides, J. Chem. Phys. **142**, 184704 (2015).
- ²²⁷ ¹⁷S. J. Cox, S. M. Kathmann, B. Slater, and A. Michaelides, J. Chem. Phys. **142**, 184705 (2015).
- ²²⁹ ¹⁸M. Fitzner, G. C. Sosso, S. J. Cox, and A. Michaelides, J. Am. Chem. Soc. **137**, 13658 ²³⁰ (2015).
- ²³¹ ¹⁹H. Heinz, R. Vaia, B. Farmer, and R. Naik, J. Phys. Chem. C **112**, 17281 (2008).
- ²³² ²⁰Z. Xu, Y. Gao, C. Wang, and H. Fang, J. Phys. Chem. C **119**, 20409 (2015).

- Publishifig. Plimpton, J. Comput. Phys. 117, 1 (1995).
 - ²³⁴ ²²G. J. Martyna, M. L. Klein, and M. Tuckerman, J. Chem. Phys. **97**, 2635 (1992).
 - ²³⁵ ²³A. Laio and M. Parrinello, Proc. Natl. Acad. Sci. U.S.A. **99**, 12562 (2002).
 - ²³⁶ ²⁴A. Barducci, G. Bussi, and M. Parrinello, Phys. Rev. Lett. **100**, 020603 (2008).
 - ²³⁷ ²⁵G. A. Tribello, M. Bonomi, D. Branduardi, C. Camilloni, and G. Bussi, Comput. Phys.
 - ²³⁸ Commun. **185**, 604 (2014).
 - ²³⁹ ²⁶G. C. Sosso, J. Chen, S. J. Cox, M. Fitzner, P. Pedevilla, A. Zen, and A. Michaelides,
 ²⁴⁰ Chem. Rev. **116**, 7078 (2016).
 - ²⁴¹ ²⁷G. C. Sosso, G. A. Tribello, A. Zen, P. Pedevilla, and A. Michaelides, J. Chem. Phys.
 ²⁴² 145, 211927 (2016).
 - ²⁴³ ²⁸G. A. Tribello, F. Giberti, G. C. Sosso, M. Salvalaglio, and M. Parrinello, J. Chem. Theory
 ²⁴⁴ Comput. 13, 1317 (2017).
 - ²⁴⁵ ²⁹B. Cheng and M. Ceriotti, J. Chem. Phys. **146**, 034106 (2017).
 - ²⁴⁶ ³⁰G. Bussi, F. L. Gervasio, A. Laio, and M. Parrinello, J. Am. Chem. Soc. **128**, 13435 ²⁴⁷ (2006).
 - ²⁴⁸ ³¹A. Laio and F. L. Gervasio, Rep. Prog. Phys. **71**, 126601 (2008).
 - ²⁴⁹ ³²D. Bonn and D. Ross, Rep. Prog. Phys. **64**, 1085 (2001).
 - ²⁵⁰ ³³S. R. Friedman, M. Khalil, and P. Taborek, Phys. Rev. Lett. **111**, 226101 (2013).
 - ²⁵¹ ³⁴R. Evans, M. C. Stewart, and N. B. Wilding, Phys. Rev. Lett. **117**, 176102 (2016).
 - ²⁵² ³⁵F. Caupin, S. Sasaki, and S. Balibar, J. Phys. Condens. Matter **20**, 494228 (2008).
 - ²⁵³ ³⁶S. Toxvaerd and J. C. Dyre, J. Chem. Phys. **134**, 081102 (2011).
 - ²⁵⁴ ³⁷P. J. int Veld, A. E. Ismail, and G. S. Grest, J. Chem. Phys. **127**, 144711 (2007).
 - ²⁵⁵ ³⁸R. E. Isele-Holder, W. Mitchell, and A. E. Ismail, J. Chem. Phys. **137**, 174107 (2012).
 - ²⁵⁶ ³⁹R. E. Isele-Holder, W. Mitchell, J. R. Hammond, A. Kohlmeyer, and A. E. Ismail, J.
 ²⁵⁷ Chem. Theory Comput. 9, 5412 (2013).
 - ²⁵⁸ ⁴⁰L. Joly, J. Chem. Phys. **135**, 214705 (2011).
 - ²⁵⁹ ⁴¹S. Gravelle, C. Ybert, L. Bocquet, and L. Joly, Phys. Rev. E **93**, 033123 (2016).
 - ²⁶⁰ ⁴²A. Hens, R. Agarwal, and G. Biswas, Int. J. Heat Mass Transfer **71**, 303 (2014).
 - ⁴³G. Nagayama, M. Takematsu, H. Mizuguchi, and T. Tsuruta, J. Chem. Phys. **143**, 014706
 (2015).
 - ²⁶³ ⁴⁴J. Iyer, J. D. Mendenhall, and D. Blankschtein, J. Phys. Chem. B **117**, 6430 (2013).
 ²⁶⁴ ⁴⁵C. Tran and V. Kalra, J. Chem. Phys. **140**, 134902 (2014).



- Publishiffg. Radu and K. Kremer, Phys. Rev. Lett. 118, 055702 (2017).
 - ²⁶⁶ ⁴⁷A. Reinhardt and J. P. Doye, J. Chem. Phys. **141**, 084501 (2014).
 - ²⁶⁷ ⁴⁸R. Cabriolu and T. Li, Phys. Rev. E **91**, 052402 (2015).
 - ²⁶⁸ ⁴⁹Y. Bi, R. Cabriolu, and T. Li, J. Phys. Chem. C **120**, 1507 (2016).
 - $_{269}$ $^{50}\mathrm{Y}.$ Qiu and V. Molinero, Crystals 7, 86 (2017).
 - ²⁷⁰ ⁵¹A. J. Bourque, C. R. Locker, and G. C. Rutledge, J. Phys. Chem. B **121**, 904 (2017).





