

- Mold: a LAMMPS package to compute interfacial free
- energies and nucleation rates
- Andres R. Tejedor 1,2, Ignacio Sanchez-Burgos 3, Eduardo Sanz 2,
- 4 Carlos Vega 6 2, Felipe J. Blas 6 4, Ruslan Davidchack 6 5, Nicodemo Di
- Pasquale ⁶, Jorge Ramirez ^{7¶}, and Jorge R. Espinosa ^{2¶}
- 1 Yusuf Hamied Department of Chemistry, University of Cambridge, United Kingdom 2 Departamento
- 7 de Química Física, Facultad de Ciencias Químicas, Universidad Complutense de Madrid, Spain 3
- Cavendish Laboratory, Department of Physics, University of Cambridge, United Kingdom 4 Laboratorio de Simulacion Molecular y Quimica Computacional, CIQSO-Centro de Investigacion en Quimica
- Sostenible and Departamento de Ciencias Integradas, Universidad de Huelva, Spain **5** Department of
- Mathematics, University of Leicester, United Kingdom 6 Department of Chemical Engineering, Brunel
- 12 University London, United Kingdom 7 Department of Chemical Engineering, Universidad Politécnica de
- Madrid, Spain ¶ Corresponding author

DOI: 10.xxxxx/draft

Software

- Review 🗗
- Repository 🖸
- Archive ☑

Editor: Lucy Whalley ♂

Reviewers:

- @mattwthompson
- @marjanAlbouye

Submitted: 20 October 2023 **Published:** unpublished

License

Authors of papers retain copyright, and release the work under a Creative Commons Attribution 4.0 International License (CC BY 4.0).

Summary

The determination of the free energy cost of forming an interface between two phases, *i.e.* the interfacial free energy, is critical for characterizing a phase transition. In the particular case of liquid-to-solid transitions, obtaining this quantity is not straightforward; neither experimentally nor computationally. Here, we present a computational package integrated in the Molecular Dynamics open-source software LAMMPS (Large-Scale Atomic/Molecular Massively Parallel Simulator)(Thompson et al., 2022), which enables the direct calculation of the interfacial free energy between arbitrarily complex crystal structures and liquids/solutions at coexistence conditions through the Mold Integration method (J. Espinosa et al., 2014). Furthermore, the extension of this method for determining crystal nucleation rates—i.e., the probablity of a critical nucleus to emerge per unit of volume and time within a metastable phase—is also incorporated in the package, termed Lattice Mold method (J. R. Espinosa, Sampedro, et al., 2016). Altogether, we detail here the required codes, scripts, and instructions for evaluating the two most challenging quantities determining the feasibility of a liquid-to-solid transition, implemented to be included in the MD package LAMMPS.

Statement of need

Liquid-to-solid phase transitions are present in many physical and industrial processes such as freezing (J. R. Espinosa, Vega, et al., 2016), nucleation (Mer, 1952), casting (Asta et al., 2009) or welding (Asta et al., 2009). A thorough knowledge of the underlying thermodynamic processes is essential for understanding and controlling such phenomena. In particular, the interfacial free energy, defined as reversible work required to form a unit area of the interface between two coexisting phases, is crucial for determining the conditions that lead to a phase transition. The calculation of the interfacial free energy of liquid-vapour or liquid-liquid phases can be easily attained by analyzing the anisotropy of the stress tensor (Kirkwood & Buff, 1949), (Walton et al., 1983). However, the same method leads to flawed results when used in systems involving solid phases (Di Pasquale & Davidchack, 2020). For that reason, here we present two different computational methods that can be directly incorporated in the LAMMPS code to facilitate their functionality.



Scientific background

50

51

52

53

54

55

- The Mold Integration method was developed by Espinosa *et al.* (J. Espinosa et al., 2014) as a simple and effective approach to calculate the interfacial free energy of crystalline phases in coexistence with a liquid phase. This technique uses potential wells, that are arranged in the simulation box as a mold that replicates a given crystallographic plane of the solid of interest. The attractive wells are modeled through a square-well-like potential that is characterized by the well radius r_w , the well depth ε_w and the well slope α . The Mold Integration method consists of the following steps:
 - 1. Preparation of the configuration, by introducing the mold into the liquid phase.
 - 2. Simulation of the liquid-mold system at constant well depth and different well radii to determine the optimal radius that keeps the liquid particles inside the wells.
 - 3. Calculation of the reversible work required to form a crystal slab at different well radii above the optimal well radius.
 - 4. Linear extrapolation of the interfacial free energy to the optimal well radius.

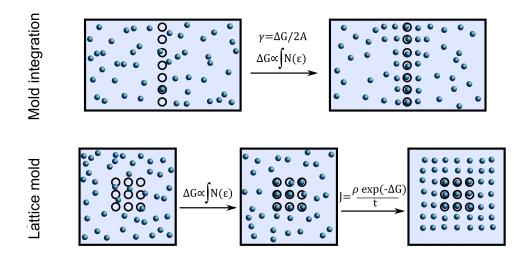


Figure 1: Top: Sketch of the thermodynamic pathway to compute the interfacial free energy using the Mold Integration method. Bottom: Schematic representation of the different steps in the Lattice Mold technique to compute the nucleation rate. In both schemes the empty black circles represent the potential wells that form the mold and the blue spheres represent the fluid particles. An extrapolation to a given well radius based on calculations performed at different radii is required in both methods.

In the top part of Figure 1 we depict a sketch of the Mold Integration method with a generic solid plane and a liquid phase, showing the induction of the solid structure inside the liquid by the interactions of the liquid particles with the potential wells forming the mold (empty black circles). In stage 2, the depth of the wells is fixed to a value such that each well is filled with a fluid particle. Changes in the well radius leads to a modulation of the required free energy to create a crystal slab. A larger radius implies a longer induction time to form the interface so that the optimal radius is defined as the largest radius for which there is no induction time (J. Espinosa et al., 2014). The thermodynamic integration (stage 3) is perfomed then for values above the optimal radius that allow reversibility (in the formation of the crystal slab) by varying the well depth for each radius. Extrapolating the interfacial energy to the optimal radius (stage 4) provides the estimation of the interfacial free energy.

The nucleation rate is also a fundamental observable required to characterize nucleation phenomena. In this respect, the idea of using a mold to induce a crystal nucleus in the fluid



71

73

74

77

78

79

80

81

82

84

85

86

87

88

89

111

113

114

115

117

118

119

121

leads to the Lattice Mold technique (J. R. Espinosa, Sampedro, et al., 2016). In this method the nucleation rate is calculated by introducing a mold made of attractive wells whose positions are given by the crystallographic position of the solid at the same temperature for which the nucleation rate aims to be computed. In contrast with the Mold Integration method, the mold is not a crystal plane but a crystal cluster, typically with spherical shape, since this shape minimizes the interfacial area of the emerging cluster within the metastable fluid. In this case, the optimal radius of the well is reached in the limit beyond which more than a single fluid particle occupies a well. Hence, the thermodynamic integration is carried out for smaller radii than the optimal one. The mold must allow the system to nucleate (at maximum well depth) after a sufficiently long induction time, therefore ensuring reversibility across the thermodynamic integration step. This method can be summarized as follows:

- 1. Preparation of the configuration by introducing the crystal mold nucleus into the liquid phase.
- 2. Simulation with different well radii and a constant value of the well depth (which ensures that wells are filled) in order to determine the optimal well radius.
- Evaluation of the free energy required to fill the mold with liquid particles and generate a pre-critical cluster at several well radii below the optimal one.
- 4. Calculation of the average nucleation time for each well radius over different independent trajectories.

In the bottom part of Figure 1 we depict a schematic picture of the Lattice Mold technique,

showing the different simulation steps to compute the nucleation rate of the system (see

5. Extrapolation of the nucleation rate to the optimal well radius.

(Sanchez-Burgos et al., 2022) for further details). The nucleation free energy to form a 91 sub-critical cluster is calculated from the well-occupancy vs well depth curve for each well 92 radius. The average induction time is then calculated by running independent trajectories 93 (at the highest well depth used in the previous step) and measure the time it takes for the pre-critical crystal nucleus to overcome the free energy barrier and percolate the whole system. To date, the Mold Integration method has been widely used to calculate solid-liquid interfacial free energy of hard spheres (J. Espinosa et al., 2014), pseudo-hard spheres (Sanchez-Burgos, Sanz, et al., 2021), Lennard-Jones (J. Espinosa et al., 2014), SPC/E water with JC NaCl (Sanchez-Burgos & Espinosa, 2023), NaCl (Tosi-Fumi) (J. R. Espinosa et al., 2015), ice-water interfaces for TIP4P, TPI4P/2005 TIP4P/Ice and mW models (J. R. Espinosa, Vega, et al., 2016), and CO₂ hydrate water interfacial energy ((Zerón et al., 2022), (Algaba et al., 2022), 101 (Romero-Guzmán et al., 2023)). The Lattice Mold method has been used to calculate the nucleation rate of pseudo-hard spheres and NaCl from its melt (J. R. Espinosa, Sampedro, 103 et al., 2016), and mW and TIP4P/Ice water models (Sanchez-Burgos et al., 2022). All 104 these simulations have been carried out with GROMACS (Abraham et al., 2015) and using a tabulated potential for the square-like attractive interaction between the wells and the fluid particles. Additionally, the typical run is more efficient in terms of computational resources 1.07 when running on LAMMPS with the analytic form of the potential (Sanchez-Burgos et al., 108 2022). In fact, when using tabulated potentials in GROMACS, long-range corrections in energy and pressure cannot be applied across the calculation, and hence, larger cut-offs in 110 the interaction potential need to be employed. This is even more notable when studying

Further to the applications of this method, the same well potential has been used for simulating 'patchy particles' (Russo et al., 2009) that consist of hard spheres with several potential wells on their surface. The present LAMMPS package enables performing efficient simulation of patchy particles using an explicit potential and thus facilitating reproducibility. These works include the study of liquid-liquid phase separation of proteins and other biomolecules ((J. R. Espinosa

complex systems such as atomistic models of water (Sanchez-Burgos et al., 2022) or hydrates (Zerón et al., 2022). Moreover, a tabulated potential needs to be generated for each run with

different well parameters, which makes the process of simulation more complex and tedious.

This package implements the square-like potential in a explicit form on LAMMPS to speed up

the simulation performance and simplify the implementation of both methods.



et al., 2019), (J. R. Espinosa et al., 2020), (Joseph et al., 2021), (Sanchez-Burgos, Espinosa, et al., 2021), (Sanchez-Burgos, Joseph, et al., 2021), (Sanchez-Burgos et al., 2023)), as well as crystallization of such particles with different topologies ((Russo et al., 2009), (Garaizar et al., 2022), (Sciortino & Zaccarelli, 2011), (Romano et al., 2011)).

Functionality

132

135

136

138

139

142

143

146

147

155

156

157

159

160

162

163

164

166

167

168

MOLD is a LAMMPS package for the calculation of interfacial free energy and nucleation rates through both the Mold Integration and the Lattice Mold techniques, respectively. The package includes the implementation of the pair potential (with the characteristic syntax of LAMMPS) to simulate the square-like potential that is used in both methods as well as in the simulation of patchy particles.

The code presented here can be found on Github, and it provides a detailed manual with the instructions to compile and use the package as well as with step-by-step examples to implement both the Mold Integration and the Lattice Mold techniques using the explicit square well potential. The package uses the pair_style square/well with three parameters that control the radius, the depth and the slope of the interaction potential. Additionally, we provide two detailed worked examples to reproduce already published results.

The first example explores the Mold Integration technique for the (100) plane of the fcc crystal for the Lennard-Jones potential. This example reproduces the results of the works of (Davidchack & Laird, 2003) using the cleaving technique and (J. Espinosa et al., 2014) using the Mold Integration method, and uses the Broughton-Gilmer modified Lennard-Jones potential (Broughton & Gilmer, 1983) that can be found in the CLEAVING package here. The second example shows step-by-step instructions to perform Lattice Mold calculations of mW lce lh nucleation rate at T=220K, reproducing the results of (Sanchez-Burgos et al., 2022) using the same method that is compatible with other methods ((Haji-Akbari, 2018),(Li et al., 2011),(Haji-Akbari et al., 2014)). Both examples include all the LAMMPS scripts, the configuration files and simple bash and Python scripts to run the simulations and analyze the results

Overall, this simulation package aims to simplify the simulation process of the presented methods and allow the community to perform simulations of solid-to-liquid phase transitions in a more efficient way.

Acknowledgements

We kindly acknowledge Dr. Lorenzo Rovigatti for sharing a Github repository as a guide to build our documentation. This project was funded by projects PID2022-136919NA-C33, PID2022-136919NB-C31, and PID2022-136919NB-C32 and PID2022-136919NB-C33 of the MICINN, and the Oppenheimer Research Fellowship of the University of Cambridge. I.S.-B. acknowledges funding from the Oppenheimer Fellowship, Derek Brewer scholarship of Emmanuel College and EPSRC Doctoral Training Programme studentship, number EP/T517847/1. N. D. P. acknowledges support from the CECAM and CCP5 through the CECAM/CCP5 sandpit grant (2022) and the EP/V028537/1 grant. J. R. acknowledges funding from the Spanish Ministry of Economy and Competitivity (PID2019-105898GA-C22) and the Madrid Government (Comunidad de Madrid-Spain) under the Multiannual Agreement with Universidad Politécnica de Madrid in the line Excellence Programme for University Professors, in the context of the V PRICIT (Regional Programme of Research and Technological Innovation). J.R.E. also acknowledges funding from the Ramon y Cajal fellowship (RYC2021-030937-I). A.R.T. acknowledges funding from the European Research Council (ERC) under the European Union Horizon 2020 research and innovation programme (grant agreement 803326), and from the Ramon y Cajal fellowship. This work has been performed using resources provided by the Cambridge Tier-2 system operated by the University of Cambridge Research Computing Service



(http://www.hpc.cam.ac.uk) funded by EPSRC Tier-2 capital grant EP/P020259/1.This project made use of time on HPC granted via the UK High–End Computing Consortium for Biomolecular Simulation, HECBioSim (http://hecbiosim.ac.uk), supported by EPSRC (grant no. EP/X035603/1). F. J. B. also acknowledges Ministerio de Ciencia e Innovación (Grant No. PID2021-125081NB-I00), Junta de Andalucía (P20-00363), and Universidad de Huelva (P.O. FEDER UHU-1255522 and FEDER-UHU-202034), all four cofinanced by EU FEDER funds.

References

177

- Abraham, M. J., Murtola, T., Schulz, R., Páll, S., Smith, J. C., Hess, B., & Lindahl, E. (2015).
 GROMACS: High performance molecular simulations through multi-level parallelism from laptops to supercomputers. *SoftwareX*, *1*, 19–25. https://doi.org/10.1016/j.softx.2015.06.
- Algaba, J., Acuña, E., Míguez, J. M., Mendiboure, B., Zerón, I. M., & Blas, F. J. (2022).
 Simulation of the carbon dioxide hydrate-water interfacial energy. *Journal of Colloid and Interface Science*, 623, 354–367. https://doi.org/10.1016/j.jcis.2022.05.029
- Asta, M., Beckermann, C., Karma, A., Kurz, W., Napolitano, R., Plapp, M., Purdy, G., Rappaz, M., & Trivedi, R. (2009). Solidification microstructures and solid-state parallels: Recent developments, future directions. *Acta Materialia*, 57(4), 941–971. https://doi.org/10.1016/j.actamat.2008.10.020
- Broughton, J. Q., & Gilmer, G. H. (1983). Molecular dynamics investigation of the crystal–fluid interface. I. Bulk properties. *Journal of Chemical Physics*, 79(10), 5095–5104. https://doi.org/10.1063/1.445633
- Davidchack, R. L., & Laird, B. B. (2003). Direct calculation of the crystal–melt interfacial free energies for continuous potentials: Application to the lennard-jones system. *The Journal of Chemical Physics*, 118(16), 7651–7657. https://doi.org/10.1063/1.1563248
- Di Pasquale, N., & Davidchack, R. L. (2020). Shuttleworth equation: A molecular simulations perspective. *The Journal of Chemical Physics*, 153(15), 154705. https://doi.org/10.1063/5.0028219
- Espinosa, J. R., Garaizar, A., Vega, C., Frenkel, D., & Collepardo-Guevara, R. (2019).

 Breakdown of the law of rectilinear diameter and related surprises in the liquid-vapor coexistence in systems of patchy particles. *The Journal of Chemical Physics*, 150(22), 224510. https://doi.org/10.1063/1.5098551
- Espinosa, J. R., Joseph, J. A., Sanchez-Burgos, I., Garaizar, A., Frenkel, D., & Collepardo-Guevara, R. (2020). Liquid network connectivity regulates the stability and composition of biomolecular condensates with many components. *Proceedings of the National Academy* of Sciences, 117(24), 13238–13247. https://doi.org/10.1073/pnas.1917569117
- Espinosa, J. R., Sampedro, P., Valeriani, C., Vega, C., & Sanz, E. (2016). Lattice mold technique for the calculation of crystal nucleation rates. *Faraday Discussions*, 195, 569–582. https://doi.org/10.1039/C6FD00141F
- Espinosa, J. R., Vega, C., & Sanz, E. (2016). Ice—water interfacial free energy for the TIP4P, TIP4P/2005, TIP4P/ice, and mW models as obtained from the mold integration technique.

 The Journal of Physical Chemistry C, 120(15), 8068–8075. https://doi.org/10.1021/acs.jpcc.5b11221
- Espinosa, J. R., Vega, C., Valeriani, C., & Sanz, E. (2015). The crystal-fluid interfacial free energy and nucleation rate of NaCl from different simulation methods. *The Journal of Chemical Physics*, 142(19), 194709. https://doi.org/10.1063/1.4921185



- Espinosa, J., Vega, C., & Sanz, E. (2014). The mold integration method for the calculation of the crystal-fluid interfacial free energy from simulations. *The Journal of Chemical Physics*, 141(13), 134709. https://doi.org/10.1063/1.4896621
- Garaizar, A., Higginbotham, T., Sanchez-Burgos, I., Tejedor, A. R., Sanz, E., & Espinosa, J. R. (2022). Alternating one-phase and two-phase crystallization mechanisms in octahedral patchy colloids. *The Journal of Chemical Physics*, 157(13), 134501. https://doi.org/10.1063/5.0101529
- Haji-Akbari, A. (2018). Forward-flux sampling with jumpy order parameters. *The Journal of Chemical Physics*, 149(7). https://doi.org/10.1063/1.5018303
- Haji-Akbari, A., DeFever, R. S., Sarupria, S., & Debenedetti, P. G. (2014). Suppression of sub-surface freezing in free-standing thin films of a coarse-grained model of water. *Physical Chemistry Chemical Physics*, 16(47), 25916–25927. https://doi.org/10.1039/C4CP03948C
- Joseph, J. A., Espinosa, J. R., Sanchez-Burgos, I., Garaizar, A., Frenkel, D., & Collepardo-Guevara, R. (2021). Thermodynamics and kinetics of phase separation of protein-RNA mixtures by a minimal model. *Biophysical Journal*, 120(7), 1219–1230. https://doi.org/10.1016/j.bpj.2021.01.031
- Kirkwood, J. G., & Buff, F. P. (1949). The statistical mechanical theory of surface tension.

 The Journal of Chemical Physics, 17(3), 338–343. https://doi.org/10.1063/1.1747248
- Li, T., Donadio, D., Russo, G., & Galli, G. (2011). Homogeneous ice nucleation from supercooled water. *Physical Chemistry Chemical Physics*, 13(44), 19807–19813. https://doi.org/10.1039/C1CP22167A
- Mer, V. K. L. (1952). Nucleation in phase transitions. *Industrial & Engineering Chemistry*, 44(6), 1270–1277. https://doi.org/10.1021/ie50510a027
- Romano, F., Sanz, E., & Sciortino, F. (2011). Crystallization of tetrahedral patchy particles in silico. *The Journal of Chemical Physics*, 134(17), 174502. https://doi.org/10.1063/1. 3578182
- Romero-Guzmán, C., Zerón, I. M., Algaba, J., Mendiboure, B., Míguez, J. M., & Blas, F. J. (2023). Effect of pressure on the carbon dioxide hydrate—water interfacial free energy along its dissociation line. *The Journal of Chemical Physics*, 158(19), 194794. https://doi.org/10.1063/5.0139699
- Russo, J., Tartaglia, P., & Sciortino, F. (2009). Reversible gels of patchy particles: Role of the valence. *The Journal of Chemical Physics*, 131(1), 014504. https://doi.org/10.1063/1. 3153843
- Sanchez-Burgos, I., & Espinosa, J. R. (2023). Direct calculation of the interfacial free energy between NaCl crystal and its aqueous solution at the solubility limit. *Physical Review Letters*, 130(11), 118001. https://doi.org/10.1103/PhysRevLett.130.118001
- Sanchez-Burgos, I., Espinosa, J. R., Joseph, J. A., & Collepardo-Guevara, R. (2021). Valency and binding affinity variations can regulate the multilayered organization of protein condensates with many components. *Biomolecules*, 11(2), 278. https://doi.org/10.3390/biom11020278
- Sanchez-Burgos, I., Herriott, L., Collepardo-Guevara, R., & Espinosa, J. R. (2023). Surfactants
 or scaffolds? RNAs of varying lengths control the thermodynamic stability of condensates
 differently. Biophysical Journal, 2973–2987. https://doi.org/10.1016/j.bpj.2023.03.006
- Sanchez-Burgos, I., Joseph, J. A., Collepardo-Guevara, R., & Espinosa, J. R. (2021). Size
 conservation emerges spontaneously in biomolecular condensates formed by scaffolds
 and surfactant clients. Scientific Reports, 11(1), 15241. https://doi.org/10.1038/
 s41598-021-94309-y



- Sanchez-Burgos, I., Sanz, E., Vega, C., & Espinosa, J. R. (2021). Fcc vs. Hcp competition in colloidal hard-sphere nucleation: On their relative stability, interfacial free energy and nucleation rate. *Physical Chemistry Chemical Physics*, 23(35), 19611–19626. https://doi.org/10.1039/D1CP01784E
- Sanchez-Burgos, I., Tejedor, A. R., Vega, C., Conde, M. M., Sanz, E., Ramirez, J., & Espinosa, J. R. (2022). Homogeneous ice nucleation rates for mW and TIP4P/ICE models through lattice mold calculations. *The Journal of Chemical Physics*, 157(9), 094503. https://doi.org/10.1063/5.0101383
- Sciortino, F., & Zaccarelli, E. (2011). Reversible gels of patchy particles. *Current Opinion*in Solid State and Materials Science, 15(6), 246–253. https://doi.org/10.1016/j.cossms.
 2011.07.003
- Thompson, A. P., Aktulga, H. M., Berger, R., Bolintineanu, D. S., Brown, W. M., Crozier, P. S., Veld, P. J. in't, Kohlmeyer, A., Moore, S. G., Nguyen, T. D., Shan, R., Stevens, M. J., Tranchida, J., Trott, C., & Plimpton, S. J. (2022). LAMMPS-a flexible simulation tool for particle-based materials modeling at the atomic, meso, and continuum scales. *Computer Physics Communications*, 271, 108171. https://doi.org/10.1016/j.cpc.2021.108171
- Walton, J., Tildesley, D., Rowlinson, J., & Henderson, J. (1983). The pressure tensor at the planar surface of a liquid. *Molecular Physics*, 48(6), 1357-1368. https://doi.org/10.1080/00268978300100971
- Zerón, I. M., Míguez, J. M., Mendiboure, B., Algaba, J., & Blas, F. J. (2022). Simulation of the CO2 hydrate-water interfacial energy: The mold integration-guest methodology. *The Journal of Chemical Physics*, 157(13), 134709. https://doi.org/10.1016/j.actamat.2008.
 10.020

