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Phase diagram of hydrogen and a hydrogen-helium mixture at planetary conditions by quantum Monte Carlo simulations

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Understanding planetary interiors is directly linked to our ability of simulating exotic quantum mechanical systems such as hydrogen (H) and hydrogen-helium (H-He) mixtures at high pressures and temperatures. Equations of State (EOSs) tables based on Density Functional Theory (DFT), are commonly used by planetary scientists, although this method allows only for a qualitative description of the phase diagram. Here we report quantum Monte Carlo (QMC) molecular dynamics simulations of pure H and H-He mixture. We calculate the first QMC EOS at 6000 K for an H-He mixture of a proto-solar composition, and show the crucial influence of He on the H metallization pressure. Our results can be used to calibrate other EOS calculations and are very timely given the accurate determination of Jupiter's gravitational field from the NASA Juno mission and the effort to determine its structure.

Since a few decades the link between the uncertainty of the hydrogen equation of state and the internal structure of Jupiter (and other gaseous planets) has been investigated and many efforts to model Jupiter's interior have been carried[1–4]. The computation of an EOS from first principles requires to solve a many-body quantum mechanical problem, a task which is beyond the currently available theoretical and computational capabilities. In practice, we must resort to several approximations. The first is to decouple the ionic and electronic problems and consider the ions as classical or quantum particles, determining their motion by following the Born-Oppenheimer potential energy surface. The second approximation concerns the description of the electronic interaction and the exchange one, due to the Pauli exclusion principle.

The standard approach to EOS calculations relies on Density Functional Theory (DFT), which targets the tridimensional electronic density rather than the (N_e electrons) many-body wave-function. Its success and simplicity have led to a widespread application in materials science and to the development of several software packages which allow fast and reproducible calculations[9]. Although DFT is *formally* exact, the explicit functional form to describe the exchange and correlation (XC) effects between electrons remains approximated[10]. Indeed, a systematic and efficient route to improve XC functional is still lacking. Therefore, in practical solid state calculations, benchmarks against experimental data, are often required to validate the XC functional used to describe the system in a satisfactory manner.

Hydrogen-rich compounds under pressure, both in the low temperature solid and in the liquid phase remain a challenge to DFT simulations due to the interplay of strong correlation and non-covalent interactions between the atoms. DFT calculations with different functionals

can produce different results, with the expected metallization pressure varying over a range of 100-200 GPa (Fig. 1)[11, 12] for pure H.

This uncertainty affects the EOS calculation, and therefore, also planetary modeling. Currently, planetary modelers use hydrogen EOS that have been derived from DFT data[18, 19], using a specific choice for the density functional, the Perdew-Burke-Erzenhof (PBE) functional[20]. It has been demonstrated that a change in the functional, for example using one which includes an empirical Van der Waals dispersion interaction (vdW-DF2[21]), results in a different EOS. In this case the calculated pressure at given density is larger of $\sim 10 - 20\%$ [12] compared to PBE. On the other hand, given the accurate determination of Jupiter's gravitational field by the Juno mission, it was shown that the EOSs should be known with accuracy of $\sim 1\%$ in order to constrain Jupiter's internal structure[22].

In the case of hydrogen at high pressure it is difficult to assess *a posteriori* the quality of the DFT approximation, benchmarking with experiments, for various reasons. The first is that experiments typically have uncertainties larger than 1% for both Hugoniot[22, 23] and phase boundaries measurements. In this second case, experiments performed with different compression techniques do not always agree. For example, static compression with laser-heating[7, 8, 24] and dynamic compression measurements (with deuterium)[6] differ by ~ 150 GPa at 1500 K for what concern the location of the first-order liquid-liquid transition between the molecular and the atomic fluids.

On the simulation side, PBE functional[25–28] seems to agree qualitatively with the experimental Refs. 8, 24, whereas vdW-DF2[12] is more compatible with Refs. 6 and 29. Therefore, the possibility of validating existing EOS, and reconcile simulations with experiments, is

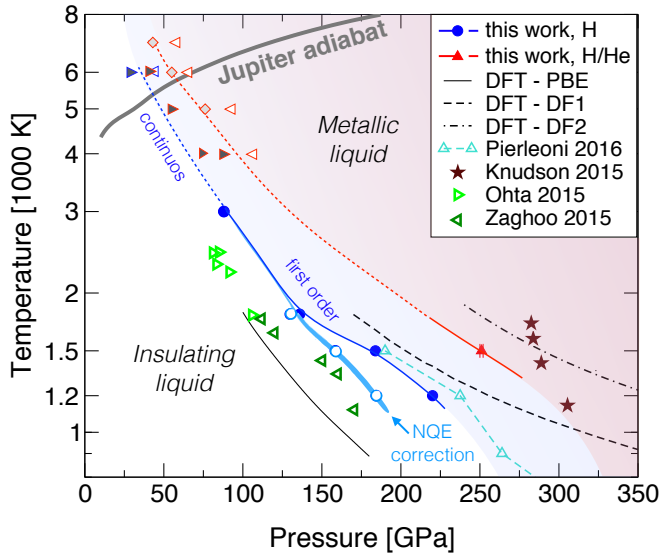


Figure 1: **Phase diagram of dense hydrogen (H) and a hydrogen-helium (H-He) mixture.** We show the liquid-liquid transition (LLT) between the insulating-molecular and the metallic-atomic fluid (shaded area). Theoretical results have been obtained under the classical nuclei approximation unless otherwise indicated. Solid symbols refer to our QMC LLT for pure H (blue circles) and for the H-He mixture (red triangle). Solid blue and red lines indicate a first-order LLT. At high temperatures, the empty (solid) left (right) triangle correspond to simulations displaying a clear atomic (molecular) behaviour, while red diamonds represent an intermediate behaviour (see Supplementary Materials[13]). These points are used to constrain the phase boundaries where the transition is continuous (dashed blue and red lines). Also shown is Jupiter’s adiabat (grey line) as calculated by Miguel et al. [3]. Pure H first-order LLTs predictions by QMC simulations (from Pierleoni et. al. [5] (cyan)) and by DFT using different XC functionals: PBE, vdW-DF1, and DF2 (taken from Knudson. et. al. [6]), are also shown. Other symbols refer to metallization experimental data. Shown are experiments with static compression [7, 8] (light and dark green triangles) and deuterium shockwave[6] (brown stars).

highly desirable. This is also true in the case of H-He mixture, where experiments are still missing.

Recently, QMC approaches emerged as competitive tools to solve accurately electronic problems[30] thanks to the new generations of super-computers. Since QMC is a wave-function-based method (unlike DFT) the scheme to obtain consistently better results is simple and relies on the variational principle. Indeed, the accuracy of the calculations improves as the richness of the many-body electronic wavefunction increases. In our variational approach, a systematic way to improve the wavefunction is by enlarging the localized atomic basis set that defines our quantum state. The unprecedented availability of computational resources led to the development of QMC algorithms, that combine efficiently the simulations of electrons with ion dynamics[31–33]. Unlike the

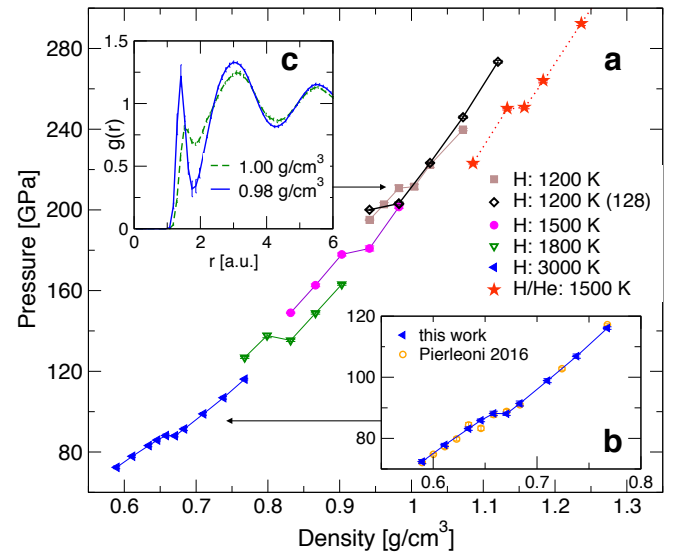


Figure 2: **Equations of state across first-order transitions.** Pressure vs. density for pure H and four temperatures (1200, 1500, 1800 and 3000 K, 64 particles) and for a H-He mixture (at 1500 K, 128 particles). For H at 1200 K, we present results also for a 128 particles system (black diamonds). The transition pressure obtained with the 128 particle setup is smaller by 8(2) GPa compared to the 64 particle case. The first order transition is identified by a *plateau* in the EOS. The discontinuity is more evident at lower temperatures but is still visible at 3000 K (panel a). Panel b. shows the EOS computed by Pierleoni et. al. [5]. Panel c. shows two proton radial pair distributions for pure H at 1200 K, for the two densities close to the LLT. The sudden disappearance of the molecular peak is consistent with a first-order transition.

DFT method, which is well-established and widely used, the QMC technique is still relatively new and is used by a smaller community of developers with various implementations and algorithms that are difficult to benchmark. However, the few QMC results for the H phase diagram, until now, have not agreed well. In particular, while all QMC simulations agreed qualitatively on a larger dissociation and metallization pressure for pure dense liquid H, compared to PBE, the precise location was not well-determined due to different QMC implementations, variational wave-function, and finite size effects errors[5, 28, 33–35].

We perform simulations with 64 and 128 H atoms for the H compound and with 118 H and 10 He atoms for the H-He mixture (see Supplementary Information for details). For the mixture we use $x = n_{He}/n_H \approx 0.08475$ which is smaller than the proto-solar value of 0.0969[36] and slightly larger than Jupiter’s value of 0.0785(18)[37]. We first trace the liquid-liquid transition (LLT) for pure H at intermediate temperatures, between 1200K and 1800 K, using a 64 hydrogen atom system. The first-order transition is characterized by a discontinuity in the EOS (see Fig. 2) and in the proton-proton radial pair

distribution function $g(r)$ (Fig. 2c). It is found to occur at densities of $\sim 0.8 - 1 \text{ g cm}^{-3}$ and pressures of $\sim 200 \text{ GPa}$ at 1200 K , $\sim 180 \text{ GPa}$ at 1500 K , and $\sim 135 \text{ GPa}$ at 1800 K . The LLT seems to involve mostly a local-rearrangement of the liquid structure (see Fig. 2c and Supplementary Fig. S1) and lies between the two recent experiments obtained using static compression by Silveira and coworkers[8, 24] and the dynamic compression measurements (with deuterium) by Knudson et al.[6], although it is much closer to the first reference. Moreover, the systematic errors caused by the finite size (cf. the 64 and 128 particle data series in Fig. 2) and basis set (cf. Supplementary Fig. S2) can shift the LLT by $\sim 10 \text{ GPa}$, therefore, our results are compatible with the recent QMC prediction by Pierleoni et. al.[5]. However, in order to better compare our results with these low temperature experiments, also the quantum nature of the protons (here assumed as classical particles) needs to be considered. Indeed, when we correct our results with these nuclear quantum effects (NQE), the agreement with static compression experiments improves significantly [8, 24, 38] (see Fig.1). In this work we do not perform directly simulations beyond the classical nuclei approximation, using *path integral* based methods as in Ref. 5, where electronic QMC simulations with or without NQE are reported. They show that NQE shifts the LLT to smaller pressures at most by 35 GPa at 1200 K and by 25 GPa at 1500 K . Here we simply apply these shifts to our LLT to derive the phase boundary in Fig. 1 and compare to experiments[8]. Notice that PBE underestimates the metallization pressure compared to QMC (Fig. 1), and the disagreement with experiments further increases if NQE are taken into account.

In this work, we correct the systematic errors that affected our previous results and led a much larger metallization pressure: the electronic size effects errors, not adequately removed in Refs. 33, 34 and a localized basis set[39] that was too small (1Z) to describe the metal and the insulator with the same accuracy[35]. In addition, our previous studies used a less efficient optimization method, indeed, the so called "linear method"[40] requires a careful generalization to the case of complex wavefunctions (see Supplementary Informations for details). Nevertheless, as discussed above, our predicted LLT is now affected by an uncertainty of $\sim 10 \text{ GPa}$. We believe that, computing the H phase diagram with an accuracy of 1 GPa , is still beyond the present numerical capabilities, especially at low temperatures.

After benchmarking our technique for pure H, we next investigate an H-He mixture at 1500 K . We find that He, even in a small fraction $x \approx 0.085$, changes qualitatively the physics of the system. In particular, its presence stabilizes the hydrogen molecules (H_2), delaying the onset of metallization towards higher densities. This effect is also observed in DFT-PBE simulations (cf. Vorberger et. al.[41]). However, our direct QMC simulations clearly

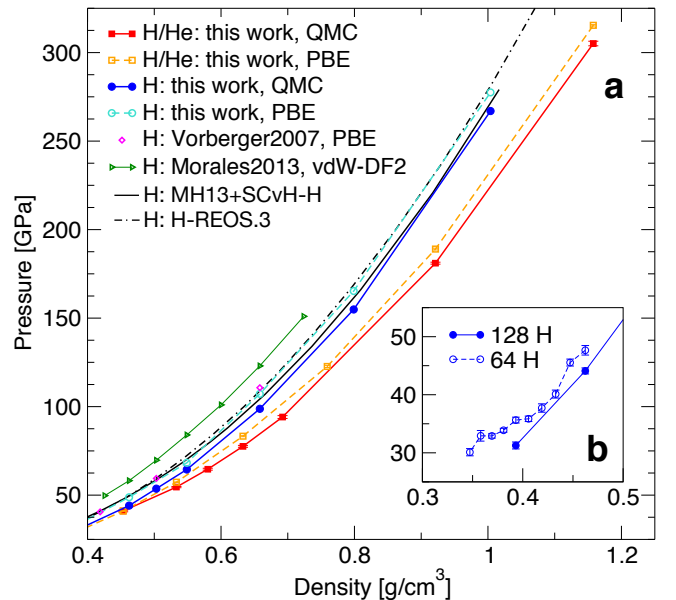


Figure 3: **Equations of state at 6000 K.** Panel a. shows the EOS with QMC (solid lines) and DFT-PBE (dashed) for pure H (circles) and the H-He mixture (triangles) inferred using a supercell of 128 particles. For the pure H case we also report PBE calculations of Vorberger et. al. [41], simulations with the vdW-DF2 functional,[12] and the commonly used EOSs for pure H, H-REOS.3[19] (dot-dashed black line) and MH-SCvH-H[18] (continuous black line). In the inset (b.) we show additional simulations, using a 64 hydrogen system and a finer density mesh, to investigate the nature of the pure-H dissociation. Given the moderate slope and the statistical error bars ($\approx 0.5 \text{ GPa}$) of the EOS, resolving any discontinuity is not possible at this stage.

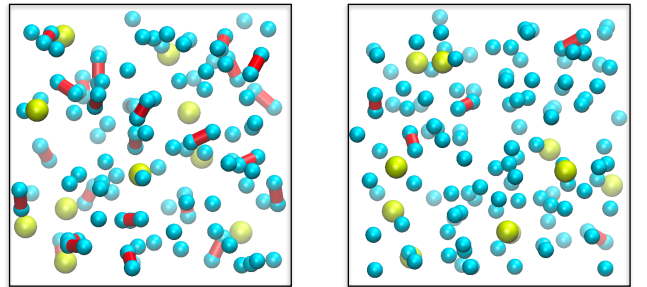


Figure 4: **Snapshots of an H-He mixture simulation.** Shown are two typical snapshots of our MD simulations. The cyan, yellow, and red colors represent the 108 H atoms, 10 He atoms and H-molecule bonds (H_2), respectively. For sake of visualization, an H_2 molecule is defined when two hydrogen atoms are closer than 1.6 Bohr. These two structures (projected on the $x-y$ plane), the first (second) represents a mainly molecular (atomic) phase, are computed at different iterations of the same MD simulation, at a temperature of 6000 K and density of $\sim 0.53 \text{ g/cm}^3$ ($P = 54.3(3) \text{ GPa}$), i.e., near the LLT.

identify the molecular dissociation in the H-He mixture at ~ 250 GPa with 1500 K, and a density ~ 1.1 g cm $^{-3}$ (see Fig. 2a), resulting in a shift of ≈ 70 GPa compared to the pure H system.

An important open question concerns the location of the H critical point, which is the end point of the first-order LLT. Above the critical point, in the $P - T$ phase diagram the dissociation occurs smoothly. While recent EOS calculations suggest that Jupiter's adiabat lies above the critical point, implying the lack of first order phase transition, its possible occurrence has a direct consequence on the internal structure of gas giant planets. If the phase transition is of first order, it would suggest a density discontinuity within the planet's interior, and the possibility of a non-adiabatic interior as well as for discontinuities in the heavy elements distribution.

Also in this case a clear experimental consensus is still missing. McWilliams et al.[29] do not find evidence for a first-order transition below 150 GPa, while Ohta et al.[7] suggest instead the persistence of a first-order LLT well above 2000 K. Motivated by these studies, we perform additional simulations at higher temperatures. In the pure H case we are able to resolve a small discontinuity in the EOS and the $g(r)$ at 3000 K (see Fig. 2). Although a finer mesh of densities is required, as well as an extended finite size scaling in order to precisely resolve the existence of the *plateau* in the EOS, the observed feature suggests the existence of a critical point above the previously expected temperature of 1500-2000 K[26, 28] (with the notable exception of Norman et al. [42] who predict a critical temperature of 4000 K from PBE simulations).

Finally, we calculate QMC and DFT-PBE EOSs at 6000 K over a wide range of densities, spanning a pressure range between 30 (40) and 260 (300) GPa for pure H (H-He mixture). This isotherm is expected to cross Jupiter's adiabat around 60 GPa, i.e., at 0.6 Mbar.

We find that QMC, at a given density, predicts a pressure which is $\sim 5\%$ smaller than PBE, i.e., at a fixed pressure, QMC predicts a denser liquid compared to PBE (see Fig. 3). Our QMC-EOS for pure H is compatible with available QMC data at 6000 K from Refs. 43, 44. This difference with PBE becomes larger at small pressures ($\sim 10\%$), across the continuous phase transition. Also shown in the figure is a comparison of our calculation with the two popular H-EOS for planetary interiors; the H-REOS.3[19] and MH-SCvH-H[18], both of them are based on PBE simulations. We show that H-REOS.3 is in perfect agreement with our DFT calculations, whereas the MH-SCvH-H EOS (extrapolating the data in the limiting case of pure H[3]) is closer to our QMC one. The disagreement between the two EOSs could be caused by the extrapolation[3], and it seems that the disagreement between these two groups is linked to the calculated entropies[3, 45]. Either way, it is clear that QMC implies a denser EOS for H at Jupiter's conditions, which trans-

lates to an envelope that is poor in heavy elements. If this is indeed the case, it introduces new challenges in understanding Jupiter's current structure and origin[3, 45, 46]. Since Jupiter structure models with a denser EOS for H lead to a very low atmospheric metallicity, with Z being 0.01 or even smaller, using QMC EOS is expected to reduce the metallicity even further. However, it should be noted that these estimates have been performed for a fully adiabatic Jupiter, and a non-adiabatic Jupiter can be more metal-rich [47, 48]. In addition, in order to accurately estimate the effect of the QMC EOS on Jupiter's structure, a much larger parameter space of temperatures and pressures should be simulated.

Regarding the nature of the phase transition at 6000 K, we find that for H our QMC simulation indicates that a continuous transition is most likely to occur, as a clear EOS discontinuity is absent (see inset of Fig. 3). This means that the critical temperature for pure H is between 3000 K and 6000 K. We can further constrain the location of the LLT by performing simulations at different temperatures and densities, identifying the largest(smallest) pressure at which a clear molecular peak persists(disappear).

For pure H, the continuous molecular dissociation occurs mainly between 31 and 44 GPa at 6000 K. This value is in very good agreement with the recent X-ray scattering measurements of a continuous metallization transition at around 50 GPa and 5000 K[49] (cfn Fig. 1). For the H-He mixture, we directly perform simulations at temperatures between 4000 and 7000 K (see Supplementary Figures S3, S4), relevant for planetary interiors (Fig. 1). At 6000 K, H $_2$ dissociation in the H-He mixture occurs mainly between 42 and 64 GPa. Moreover, at a density of ~ 0.53 g cm $^{-3}$ and $P \approx 54$ GPa, we observe the stability of a mixed phase as the simulation quickly fluctuates between a pure atomic and a mainly molecular liquid (see Fig. 4). Therefore, our calculations show that the continuous transition from molecular to metallic hydrogen in Jupiter's conditions occurs at ~ 0.4 - 0.6 Mbar. This provides further constraints for Jupiter structure models, as the transition pressure between the two envelopes cannot be used as a free parameter[3, 50]. A transition pressure of that value implies a larger mass of heavy elements in Jupiter's deep interior[3].

Our ab-initio simulations for an hydrogen-helium mixture, the first obtained with QMC, opens a new opportunity to better constrain the behavior of H and H-He in planetary conditions. We show that even a small concentration of He of $\approx 8.5\%$ has an important impact on the metallization pressure of the liquid, as the dissociation is delayed by 70 GPa at low temperature (1500 K) and by a maximum of 30 GPa at 6000 K.

QMC techniques do not only allow for an explicit description of electron correlations, and therefore are systematically improvable, but they also have the potential to expand and become commonly used with the future

generations of massively parallel supercomputers. Several new research directions can be envisaged, from the calculation of a new QMC-based EOS for pure H, to the simulations of heavier elements at planetary conditions.

New generation of QMC calculations, could tackle even larger systems (comparable with DFT simulations) and address further questions relevant for planetary interiors such as the precise location of the critical point in the H-He phase diagram, the miscibility of He and other heavier materials in H, and other intriguing physical and chemical transformations such as methane and ammonia dissociation at high pressures.

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