Quantum Monte Carlo determination of the principal Hugoniot of deuterium

Michele Ruggeri , ¹ Markus Holzmann, ^{2,3} David M. Ceperley , ⁴ and Carlo Pierleoni , ¹ ¹Maison de la Simulation, CEA, CNRS, Université Paris-Sud, UVSQ, Université Paris-Saclay, 91191 Gif-sur-Yvette, France ²Univ. Grenoble Alpes, CNRS, LPMMC, 3800 Grenoble, France ³Institut Laue Langevin, BP 156, F-38042 Grenoble Cedex 9, France ⁴Department of Physics, University of Illinois, Urbana, Illinois 61801, USA ⁵Department of Physical and Chemical Sciences, University of L'Aquila, Via Vetoio 10, I-67010 L'Aquila, Italy

(Received 5 August 2020; accepted 5 October 2020; published 22 October 2020)

We present coupled electron-ion Monte Carlo results for the principal Hugoniot of deuterium together with an accurate study of the initial reference state of shock-wave experiments. We discuss the influence of nuclear quantum effects, thermal electronic excitations, and the convergence of the potential energy surface by wavefunction optimization within variational Monte Carlo and projection quantum Monte Carlo methods. Compared to a previous study, our calculations also include low pressure-temperature (P, T) conditions resulting in close agreement with experimental data, while our revised results at higher (P, T) conditions still predict a more compressible Hugoniot than experimentally observed.

DOI: 10.1103/PhysRevB.102.144108

The determination of the hydrogen phase diagram across a large range of temperature and pressures, an important topic in planetary science, is a challenging problem mainly relying on static or dynamic compression experiments or theoretical computations [1]. Static compression experiments performed in diamond anvil cells are used to probe the properties of solid hydrogen at low temperature and of fluid hydrogen just above the melting conditions, while the fluid phase in a wider range of thermodynamic conditions is investigated using dynamical compression by shock waves, e.g., applying a short duration, high intensity force to a hydrogen or deuterium sample using a gas gun [2], converging explosive shock [3], pulsed power [4,5], laser [6–8], or magnetically driven platforms [9]. Given an initial reference state, the densities and pressures of the final state of the shock (the Hugoniot) are determined by the Rankine-Hugoniot relation, directly following from basic conservation laws in fluid dynamics [10]. A review of experimental techniques is presented in Ref. [11].

The deuterium Hugoniot can be predicted from firstprinciples simulations based either on density functional theory (DFT) or quantum Monte Carlo (QMC) techniques. DFT predictions appear to have good agreement with experiments [5], which surprisingly is seemingly independent of the exchange-correlation (XC) approximation employed, while coupled electron Monte Carlo (CEIMC) results based on QMC techniques find a more compressible Hugoniot than obtained from experiments [12]. An analysis of error propagation in the Hugoniot for several first-principles methods, including QMC and DFT [13], showed that the insensitivity of DFT to different XC functionals results from important error cancellation, whereas QMC inaccuracies may get amplified in the Hugoniot predictions. In particular, the fixed-node error of the electronic QMC energies was suggested as the possible origin of the observed deviation of the CEIMC predictions from experiments.

In this paper, we report QMC results for the principal Hugoniot, obtained by ground-state variational Monte Carlo and reptation quantum Monte Carlo, within the fixed-node or fixed-phase approximation. Nuclear motion is simulated by CEIMC. Selected nuclear configurations from CEIMC trajectories are used to study the convergence of electronic ground-state calculations. For each configuration, the converged energy and pressure are then averaged for determining the Hugoniot. Within this protocol, we studied systems at different densities for $T \leq 8000$ K, where electronic thermal effects are negligible, and compare our computed Hugoniot to experimental data and DFT results. Particular care is given to the analysis of the cryogenic fluid reference state, which plays a fundamental role in the determination of the Hugoniot curve. Since we expect the fixed-node error to be less pronounced in the molecular phase at low compression, we mainly focus on the low-compression-low-temperature part of the Hugoniot.

This paper is organized as follows: In Sec. I we review the Hugoniot-Rankine relation, reviewing the current consensus for theoretical and experimental results; in Sec. II we describe the computational methods, and the protocol followed in this study, presenting our results in Sec. III. We start with the results for the reference state, reporting several estimates of reference energies. Then, we present our results under low compression including several small corrections such as electronic thermal effect and nuclear quantum effects. Section IV reports our conclusions. In the Appendices we report a structural analysis along the Hugoniot and some details on the reptation Monte Carlo (RMC) calculations.

I. HUGONIOT-RANKINE RELATION

The equation of state of a material can be determined in shock experiments. A shock is applied to a system in an initial state at a pressure P_0 and temperature T_0 with energy per atom e_0 , and volume per atom v_0 . Depending on the strength of the shock, the system can reach final states with e, P, and v determined by the Hugoniot-Rankine relation

$$H(v,T) = e(v,T) - e_0 + \frac{1}{2}(v-v_0)[P(v,T) + P_0] = 0.$$
 (1)

In order to compare with the most precise shock experiments [5,14] we set our initial conditions to be those appropriate for liquid deuterium at T=22 K, $P_0=1.24\times10^{-4}$ GPa and $v_0=135.15a_0^3$, a_0 being the Bohr radius. In the following, we will express our volumes in terms of the Wigner-Seitz radius r_s $a_0=\sqrt[3]{\frac{3}{4\pi}v}$, with the initial volume corresponding to $r_s^0=3.18353$. We stress that a precise determination of the properties of the initial reference state is needed to define the Hugoniot; see Eq. (1). Inaccuracy of the reference energy e_0 will change the Hugoniot, especially at lower temperatures. A detailed description of the procedure that we used to determine the reference point can be found below in Sec. III A.

II. METHODS

In this study we employed first-principles simulations methods based on density functional theory (DFT) and on quantum Monte Carlo (QMC) electronic energy determination within the Born-Oppenheimer approximation [1]. The nuclear configuration space is sampled using a Metropolis Monte Carlo algorithm. Nuclei are either represented by point particles in the classical (high-temperature) limit or by path integrals for quantum particles, assumed here to be distinguishable [15]. When employing the QMC electronic solution, this method is called coupled electron-ion Monte Carlo (CEIMC) while when employing the DFT electronic solution we will call it Born-Oppenheimer Monte Carlo (DFT-BOMC) for similarity with the commonly used Born-Oppenheimer molecular dynamics (BOMD) approach. Both electronic solutions are implemented in our CEIMC code, BOPIMC.

CEIMC can exploit electronic QMC energies from both variational Monte Carlo (VMC) or reptation Monte Carlo (RMC). Both, VMC and RMC, are based on the variational principle of quantum mechanics: for any given Hamiltonian, the exact ground state will have the lowest energy; it is thus possible to estimate the ground-state wave function by defining a trial wave function $\Psi_T(\mathbf{p}; \mathbf{r})$ with a suitable functional form, which depends on a set of M variational parameters $\mathbf{p} = \{p_1, p_2, \dots, p_M\}$; $\mathbf{r} = \{\mathbf{r}_1, \mathbf{r}_2, \dots, \mathbf{r}_N\}$ are the N electronic coordinates. Within VMC, these variational parameters are numerically optimized by minimizing a linear combination of the trial energy E_T , defined as

$$E_T = \langle E_{\text{loc}}(\mathbf{r}) \rangle_{\mathbf{p}} = \frac{\int d\mathbf{r} |\Psi_T(\mathbf{p}; \mathbf{r})|^2 E_{\text{loc}}(\mathbf{r})}{\int d\mathbf{r} |\Psi_T(\mathbf{p}; \mathbf{r})|^2};$$
(2)

here $\langle \dots \rangle_p$ stands for the mean value of a quantity over the normalized probability distribution $|\Psi({\bf p};{\bf r})|^2$ and the local energy is

$$E_{loc}(\mathbf{r}) = \frac{\hat{\mathbf{H}}\Psi_T(\mathbf{p}; \mathbf{r})}{\Psi_T(\mathbf{p}; \mathbf{r})},$$
 (3)

and its variance.

RMC [16] is a projection technique: it consists in repeatedly applying the imaginary-time evolution operator $U(\tau) = \exp(-\tau \hat{H})$ to a trial wave function, preoptimized via VMC, which has the effect of filtering out components coming from excited states. As with other projection methods RMC is in principle exact for $\tau \to 0$, but for fermions it suffers from the sign problem. To circumvent the sign problem and the associated exponentially increasing cost for exact fermion calculations, the fixed-node or fixed-phase approximation is used. The resulting energy is the lowest energy consistent with the nodes or phase of the assumed trial function, hence, below the VMC energy but above the ground-state energy.

When using either VMC or RMC, an accurate trial wave function is important. In our computations we used backflow Slater-Jastrow wave functions of the form

$$\Psi_T(\mathbf{r}; \mathbf{R}) = J(\mathbf{r}; \mathbf{R}) \cdot \mathrm{Det}_{\uparrow}(\phi_i(\mathbf{q}_j)) \mathrm{Det}_{\downarrow}(\phi_i(\mathbf{q}_j)). \tag{4}$$

Here, **R** represents the set of nuclear coordinates, $J(\mathbf{r}; \mathbf{R})$ is a general Jastrow term, symmetrical under electron exchanges, which introduces electron correlations, including one- (electron-nucleus), two- (electron-electron), and threeparticle terms. The other terms in Eq. (4) are Slater determinants (one for each spin component), which ensure that the overall electronic trial wave function has the correct fermionic antisymmetry. The single-particle states $\{\phi_i\}$ are determined from a DFT computation, performed using the QUANTUM ESPRESSO software [17,18]. Instead of containing bare electronic coordinates r, the orbitals in the Slater determinants contain backflow transformed coordinates $\{\mathbf{q}_i\}$, obtained using analytical backflow transformations plus an empirical Gaussian correction [19-22]. The use of backflow coordinates introduces corrections to the nodal surface defined by the DFT orbitals in the Slater determinants, which lead to a significant improvement of the accuracy of the QMC estimates, of the order of a few mHa/atom [21].

In CEIMC nuclear sampling is performed by a generalized Metropolis scheme [23]. From a given nuclear configuration, a different configuration is proposed by an *a priori* transition probability easy to sample and an acceptance test is performed to accept or reject the move. Since the energy difference between those configurations is obtained by QMC, we need in principle to perform a new trial function optimization and a subsequent VMC or RMC energy calculation at each attempted configuration before accepting or rejecting the move. However, this is not feasible to sample configuration space.

In our protocol, as described in detail in the Supplemental Material of Ref. [24], we usually apply several shortcuts, specific to hydrogen, to reduce drastically the computational demands. First, we rely on an accurate trial wave function for hydrogen comprising an analytic function free of variational parameters [21]. This form is already rather accurate, in particular for a metallic system [22]. To this form we add empirical terms for both the Jastrow (both one, two, and three body) and the backflow which introduce up to 13 variational parameters. It is important to include these terms since they lower the energy by about 1 mHa/atom and reduce the variance by 40% for states of hydrogen around the dissociation transition. Rather than performing the parameter optimization for each proposed nuclear configuration at each density, we select a number of statistically independent nuclear

configurations (few tens), generated with an unoptimized trial function. We then optimize the variational parameters for each configuration. We then use the average values for subsequent generation of the nuclear trajectory. This procedure takes into account the variation of the parameters with density but the variational parameters are not tailored for the specific configuration. The bias in the energy is less than the statistical precision of the CEIMC method [24]. Because CEIMC is based on sampling the Boltzmann distribution, any bias introduced by inaccurate solutions of the electronic problem can be corrected for by reweighting the nuclear configurations [25]. A third shortcut is that we do not perform RMC calculations of the electronic energy to advance the nuclear sampling but we run with VMC energy and we estimate the improvement from VMC to RMC on a selected subset of nuclear configurations. As reported in the Appendices, corrections are negligibly small, within the statistical accuracy of our results, justifying our approach a posteriori.

One further limitation of our methods is the assumption of ground-state electrons. From previous works on the deuterium Hugoniot by BOMD [5] it is known that electronic thermal effects can be relevant at higher temperatures/compressions. In order to assess the relevance of those effects, we performed a DFT-BOMC study of the deuterium Hugoniot employing the van der Waals density functional (vdW-DF1) XC approximation within ground state DFT to be compared with the results of Ref. [5] where, among others, the same XC approximation, but with thermal electrons based on Mermin functional approach, has been employed. As discussed below, we infer that along the Hugoniot line, electronic thermal effects make a small corrections to the equation of state (EOS): the pressure difference at $\sim 10\,000\,\mathrm{K}$ is $\simeq 6\%$ and becomes negligible at lower compressions and temperatures. We therefore expect similar small effects within a QMC framework and negligible bias due to thermal electronic effects in CEIMC below 10 000 K. By performing excited-state VMC calculations for selected fixed nuclear configurations at the highest temperature as described in Sec. III C we explicitly confirm the minor role of electronic temperature effects.

In most of our calculations we model nuclei as classical point particles. A noticeable exception is at the reference point (initial state) where nuclear quantum effects are so large to ensure a liquid rather than a crystalline state. To establish the physical properties of the reference state, we employ three different models of increasing accuracy to be discussed in Sec. III A. Nuclear quantum effects for states along the Hugoniot are small because of the high temperature. At the lowest temperature considered (2000 K) nuclear quantum corrections on the Hugoniot are significant since the variation of the Hugoniot function with density is small. In this case we estimate nuclear quantum effects (NQE) by running DFT-BOMC with quantum nuclei represented by path integrals (see Sec. III D).

III. RESULTS

A. Reference point

When determining the Hugoniot curve described in Eq. (1) it is important to have a reliable estimate of the properties

of the reference state. In this work we assumed a density of $\rho_0 = 0.167 \text{ g/cm}^3$, corresponding to an atomic volume of $v_0 = 135.15 \, a_0^3$ or $r_s^0 = 3.18353$, as in the experiments [5,14]. This corresponds to liquid deuterium at a pressure of 124 KPa at a temperature of 22 K.

There is an ambiguity in determining the energy of the reference point in an approximate computational method. One might expect that numerical errors in the energy difference $e(v,T)-e(v_0,T_0)$ would cancel in determining the H function of Eq. (1). Note that the individual energies are about 0.5 Ha/atom but we need an accuracy in the difference of roughly 10^{-4} Ha/atom. However at high pressure (up to fivefold compression) there is a large change in the state of the molecules, and it is unlikely there would be a full cancellation of errors in an approximate method.

At low pressures, CEIMC is a very precise method because the two most important sources of errors, the fixed-node approximation and finite-size effects, are very small at low density. This is because in a system with a large gap, electrons are well localized and the electrons within the same molecule have different spins so do not need to be antisymmetrized. Also, the exchange effects between molecules are small and those effects are well approximated by the Slater-Jastrow trial function.

Rather than using the CEIMC method to directly estimate (e_0, P_0) we have used several indirect approaches which are based on the idea that at low density the system consists of weakly interacting deuterium molecules. CEIMC would require a large number of imaginary-time slice in the path-integral representation of the deuterons, resulting in an exceedingly slow dynamics to explore the phase space of the disordered molecules. In earlier work we used energies from the properties of an isolated deuterium molecule with experimental information on how D_2 molecules interact at low temperatures and densities to determine the reference point energy, pressure, and volume. We arrived at an estimate of $r_s^0 = 3.18353$, $e_0 = -0.583725$ Ha/atom, and $P_0 = 4.2 \times 10^{-9}$ a.u. $= 1.2 \times 10^{-4}$ GPa.

For our estimates we note that at the reference point the typical distance between molecules is about four times the molecular bond length. Thus, we first consider a system of quantum molecules interacting through the Silvera-Goldmann potential [26]. This is a spherically symmetric potential between molecular centers of mass. For this model we performed PIMC simulations using the pair action [15] of a system with N=32 molecules. Convergence of the results with the imaginary-time step was investigated by performing simulation with an increasing number of time slices. It was found that four time slices were enough for the convergence of the energy at 22 K. As expected, we found a liquid hydrogen molecular state. To estimate the internal energy and pressure we included a tail correction for the interaction outside of the periodic box.

To further test the CEIMC procedure, we generated the bond distances and angles of the molecules using a second PIMC simulation with the Kolos-Wolniewicz (KW) potential [27]. An estimate of the reference point properties, obtained by adding SG and KW energies, is reported in Table I.

To obtain another estimate of the reference point properties, we build nuclear configurations as follows. From the

TABLE I. Total, kinetic energy per atom and pressure computed using the Silvera-Goldman (SG) for the molecular liquid and Kolos-Wolniewicz (KW) effective potentials for the isolated molecule.

	SG	KW	Total
e _{tot} (Ha/at.)	$-2.225(2) \times 10^{-4}$	-0.583598(2)	-0.583821(2)
e _{kin} (Ha/at.)	8.893(3) ×10 ⁻⁵	0.001701(3)	0.001790(3)
P (GPa)	-0.0050(1)	0	-0.0050(1)

trajectory of the SG model we extracted 120 molecular configurations, representing the position of the center of mass of the D₂ molecules. From the PI simulations of the KW potential, we extract 32×120 snapshots that we assigned randomly to the 32 molecules in the different configurations to obtain 120 atomic configurations with 64 nuclei each. These configurations are used as source to calculate the Coulomb potentials in both the electronic QMC and DFT calculations; in QMC for each configuration we optimized the trial wave function using the correlated sampling scheme, then we computed energy and pressure with both VMC and RMC. Finally, we averaged over the configurations and added size corrections [28], reported in Table IV, to obtain the properties of the reference state. Results are reported in Table II and compared to the SG+KW model. Table II also reports the reference point values obtained with the same 120 molecular configurations using the vdW-DF1 XC functional. These values will be used in the evaluation of the DFT-BOMC Hugoniot.

The reference energies for different models are different. The RMC energy is lower than VMC energy by 5.57 mHa/at. But, the SG+KW energy is only 0.1 mHa/at. higher, almost within error bars from the RMC result. Also, the value used in previous work [12,13], based on the energy of a single D_2 molecule [27], the binding energy of solid D_2 [29] and its heat capacity [30], is only 0.13 mHa/at. higher than the reference RMC energy. The vdW-DF1 has a lower energy than the RMC reference but this depends on energy cutoff and pseudopotential: we employed a scalar relativistic projector augmented wave (PAW) pseudopotential with an energy cutoff of 40 Ry. In computing the Hugoniot within the VMC or DFT models, it is important to use the reference point of that model since we expect some cancellation of errors. In both QMC and DFT we did not consider the pressure of the reference point which in all cases is comparable to the statistical accuracy of the pressure entering the Hugoniot function (see below). For the RMC calculations we find the uncertainty in the reference point energy is about 0.1 mH/atom, and so does not affect our final estimate of the Hugoniot: see below.

TABLE II. VMC and extrapolated RMC results for the reference system with N=64 atoms, T=22 K, and $r_s=3.18353$, averaged over 120 atomic configurations.

	SG+KW	VMC	RMC	vdW-DF1
E_{el} (Ha/at.)	-0.585611(4)	-0.58013(6)	-0.58570(6)	-0.60265(6)
E_{tot} (Ha/at.)	-0.583821(2)	-0.57828(6)	-0.58385(6)	-0.60081(6)
P (GPa)	-0.0050(1)	0.52(6)	-0.17(6)	-0.54(4)

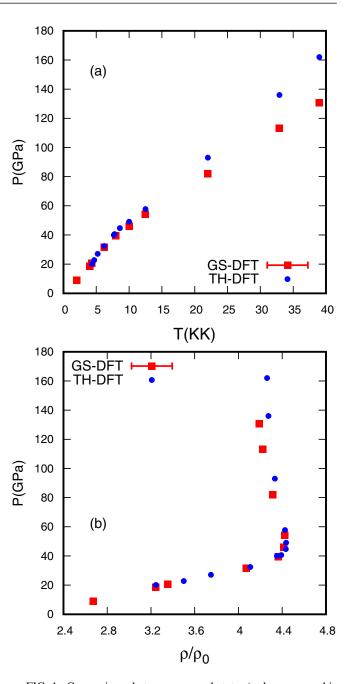


FIG. 1. Comparison between ground-state (red squares, this work) and thermal electrons (blue circles, [5]) for thermodynamic points along the principal Hugoniot as obtained with DFT vdW-DF1 based simulations. None of the points included nuclear quantum effects in the calculations.

B. Hugoniot computations

We performed both DFT-BOMC and CEIMC calculations for 54 classical deuterons in a periodic box. In both DFT and CEIMC we sum over a $4 \times 4 \times 4$ regular grid of k points. Single-electron orbitals in the CEIMC trial function are from PBE-DFT [31] with an plane-wave energy cutoff of 40 Ry while in DFT-BOMC we employed vdW-DF1 XC approximation with the same energy cutoff.

Using DFT-BOMC we ran at temperatures of 2000, 4000, 4446, 6207, 8000, 10000, 12500, 22000, 32900,

TABLE III. VMC and RMC results for energy per atom, pressure, and Hugoniot. The values include finite-size effects and nuclear quantum and thermal effects.

T (K)	r_s	ρ/ρ_0	E _{VMC} (Ha/at.)	P _{VMC} (a.u.)	P _{VMC} (GPa)	H _{VMC} (Ha/at.)	E _{RMC} (Ha/at.)	P _{RMC} (a.u.)	P _{RMC} (GPa)	H _{RMC} (Ha/at.)
22	3.18353	1.00	-0.57828(6)	0.000018(2)	0.52(6)		-0.58385(6)	-0.000006(2)	-0.17(6)	
2000	2.20	3.03	-0.56845(7)	0.000337(5)	9.9(1)	-0.0055(3)	-0.57192(5)	0.000308(4)	9.1(1)	-0.0021(2)
	2.25	2.83	-0.56921(6)	0.000270(4)	7.9(1)	-0.0028(2)	-0.57270(5)	0.000244(4)	7.2(1)	0.0004(2)
	2.30	2.65	-0.56933(7)	0.000243(4)	7.1(1)	-0.0014(2)	-0.57296(6)	0.000229(4)	6.7(1)	0.0012(2)
	2.40	2.33	-0.56962(7)	0.000209(5)	6.1(1)	0.0005(2)	-0.57371(5)	0.000176(4)	5.2(1)	0.0033(2)
4000	1.80	5.53	-0.5424(2)	0.001611(14)	47.4(4)	-0.0534(8)	-0.5451(2)	0.001599(13)	47.1(4)	-0.0499(7)
	2.00	4.03	-0.5503(1)	0.000826(9)	24.3(3)	-0.0141(5)	-0.5536(1)	0.000808(8)	23.8(2)	-0.0109(4)
	2.20	3.03	-0.5541(1)	0.000461(6)	13.6(2)	0.0032(3)	-0.5581(1)	0.000443(6)	13.0(2)	0.0056(3)
8000	1.80	5.53	-0.5075(2)	0.001832(16)	53.9(5)	-0.0308(9)	-0.5106(2)	0.001770(15)	52.1(4)	-0.0249(9)
	1.85	5.10	-0.5085(2)	0.001533(16)	45.1(5)	-0.0136(9)	-0.5120(2)	0.001475(16)	43.4(4)	-0.0083(9)
	1.90	4.70	-0.5098(2)	0.001295(14)	38.1(4)	-0.0006(8)	-0.5136(2)	0.001236(13)	36.4(5)	0.0044(7)
	1.92	4.56	-0.5100(2)	0.001259(14)	37.1(4)	0.0017(8)	-0.5140(2)	0.001203(14)	35.4(4)	0.0063(8)
	2.00	4.03	-0.5141(3)	0.001045(17)	30.7(5)	0.0110(9)	-0.5183(3)	0.000991(16)	29.2(5)	0.0151(9)

and 39 000 K to compare directly with results of Ref. [5] but using ground-state electrons. In Fig. 1 we report this comparison for the EOS along the principal Hugoniot. We observe a good agreement below $T = 10\,000$ K while above this temperature electronic thermal effects become increasingly large. Note that our small simulation cells do not show (nuclear) finite-size effects invoked in Ref. [5] as possible source of inaccuracy in the CEIMC results of Ref. [12].

With CEIMC we performed computations beyond those reported in Ref. [12]. In particular, we ran a lower-temperature isotherm at $T=2000~\rm K$ and more computations at $T=4000~\rm k$ and 8000 K. We did not consider higher temperatures to avoid the need of considering thermal electrons (see Sec. III C for a discussion). At each thermodynamic point, after the generation of the trajectory we selected about 100 nuclear configurations for which we optimized the trial function individually to get the VMC estimates and to perform RMC analysis. In addition, we considered both single- and two-body finite-size effects as described in Ref. [28]. The pressure was estimated using the virial estimator

$$P = \frac{2e - u}{4\pi r_s^3},\tag{5}$$

where e is the total energy per atom and u is the potential energy per atom. For each temperature and density we compute the Rankine-Hugoniot function (1), and we find the Hugoniot point, i.e., (v,T):H(v,T)=0, using a linear interpolation. Results of our analysis, including finite-size effects, are reported in Table III while finite-size effects on energy and pressure are reported in Table IV. Note that "electronic" size corrections are important to the final result, and increase with the temperature of the system, as the system becomes more metallic.

Figure 2 reports H(T, v) for the three isotherms. Each panel show results for VMC and RMC and for the DFT-BOMC calculations. Before summarizing our results in Sec. III E, in the next two subsections we need to address two effects.

C. Electronic thermal effects

A way to establish the relevance of electronic thermal effects in QMC, and possibly to estimate their size, is to perform, for given nuclear configurations, electronic OMC calculations with excitations built into the trial function. At the VMC level this is not difficult and can be realized by considering excited Slater determinants in the trial function. With enough excitations, thermal averages can be obtained by weighting each contribution with its Boltzmann weight $\sim e^{-\beta(E_n-E_0)}$. Here, E_0 is the ground-state energy and E_n the energy of the nth excited state. Unfortunately, the number of relevant excitations increases rapidly with temperature, in particular near metallization where the energy gap is small. It also depends on the grid of twists, so computing in practice the thermal correction is impractical. What we can do is to compare how the QMC energy and pressure for each excitation differ from the corresponding DFT ones. If the differences are small, we can expect that electronic thermal

TABLE IV. Finite-size effects on the energy and pressure of a system of deuterium at different temperatures and densities; the system is made of N=64 atoms for the T=22 K reference state and N=54 atoms in the other cases.

T(K)	r_s	ΔE (Ha/at.)	ΔP (a.u.)
22	3.18353	0.00050	0.0000012
2000	2.20	0.00156	0.0000104
	2.25	0.00145	0.0000088
	2.30	0.00137	0.0000078
	2.40	0.00119	0.0000057
4000	1.80	0.00326	0.0000492
	2.00	0.00259	0.0000277
	2.20	0.00172	0.0000123
8000	1.80	0.00423	0.0000703
	1.85	0.00395	0.0000597
	1.90	0.00383	0.0000543
	1.92	0.00373	0.0000504
	2.00	0.00316	0.0000371

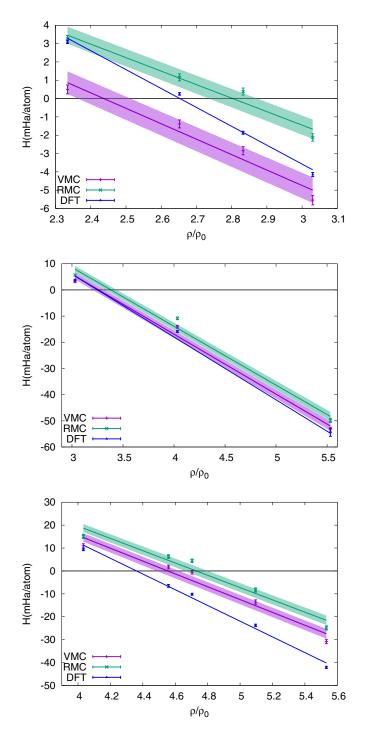


FIG. 2. QMC Hugoniot for $T=2000,\,4000,\,$ and 8000 as a function of the ratio between density ρ and density at the reference point ρ_0 . The shaded regions represent the uncertainties in the interpolations of the QMC data. Uncertainties due to changes in the reference energy are within these regions.

effects in QMC are similar and of the same size as the ones in the DFT calculations.

We selected several nuclear configurations generated during the CEIMC sampling at $T=8000~{\rm K}$ and $r_s=1.88$, very close to the density of the principal Hugoniot at this temperature, and for each configuration we ran VMC with single-

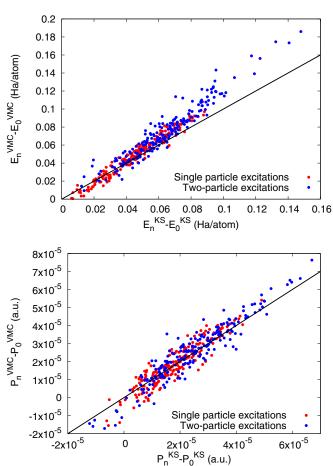


FIG. 3. VMC excitation energies versus Kohn-Sham excitation (top) and difference in pressure from VMC and DFT computations of excited states (bottom). The black line indicates equality between the VMC and DFT estimates.

and two-particle excitations. The trial wave functions for the excited states were obtained including single- and double-particle excitations in the Slater determinants in Eq. (4).

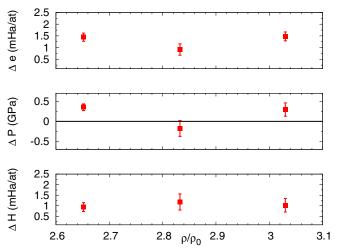


FIG. 4. Difference in energy per atom, pressure, and Hugoniot between a classical and a quantum system of 54 deuterium atoms at T = 2000 K at different densities.

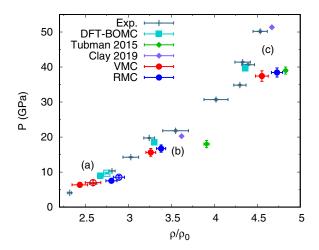


FIG. 5. QMC Hugoniot compared with previous results. We show experimental data [5,9] and theoretical DFT-BOMC and QMC data [12,13]; (a)–(c) Label different data sets, corresponding to computations performed at different temperatures, with T=2000, 4000, and 8000 K, respectively. Open symbols at T=2000 K represent our QMC and DFT-BOMC results including nuclear quantum effects (NQE); all other results are obtained with classical nuclei.

Backflow transformation was used, but the trial wave functions were not reoptimized independently for each excitation. In Fig. 3 we compare energy and pressure from VMC excited calculations and DFT excited calculations (in fact, the eigenvalues of the Kohn-Sham solution). Even if the values of the energy and pressure estimated with DFT and QMC can differ, the energy (pressure) differences between excited and ground states display a very similar behavior. Since the effect of finite temperature is to increase the population of excited states with their relative Boltzmann weight (with respect to

the ground state), having the same excitation energies means having the same thermodynamic properties. From the bottom panel of Fig. 3 we see that the virial estimator for the pressure displays the same behavior; this behavior holding for energy and pressure means that the same will apply to the Hugoniot (1). Since we have shown that at $T \leq 8000$ thermal effects are negligible in DFT, we conclude that we can safely use ground-state QMC methods to describe the electrons in our system for $T \leq 8000$ K.

D. Nuclear quantum effects

In the results described up to now, we have neglected nuclear quantum effects (NQE) except at the reference point. NQE in high-pressure hydrogen and deuterium could be relevant, depending on the thermodynamic conditions, because of the light nuclear mass and the molecular character. The energy of an isolated D₂ molecule is higher by 1089 K/atom over a molecule of classical ions, a contribution that is relevant for the present level of accuracy. We also note that the zero-temperature, zero-pressure atomic volume of solid H₂ is 16% higher than that of solid D₂, showing the significance of nuclear quantum effects in the equation of state. To gauge the influence of nuclear quantum effects on our results, we performed path-integral simulations of deuterium at T = 2000 Kat $r_s = 2.20$, 2.25, and 2.30. Because of the very good structural agreement observed between CEIMC and DFT-BOMC for classical nuclei (see Appendix A) we ran these calculations using DFT-BOMC since that requires a smaller computational resource. Path-integral simulations were performed with the strategy implemented in CEIMC and detailed in Refs. [23,24] but using DFT to evaluate the electronic energy. We found that four nuclear time slices were enough to converge the time step. Comparing results of these calculations to the results for classical nuclei we compute the correction to the energy,

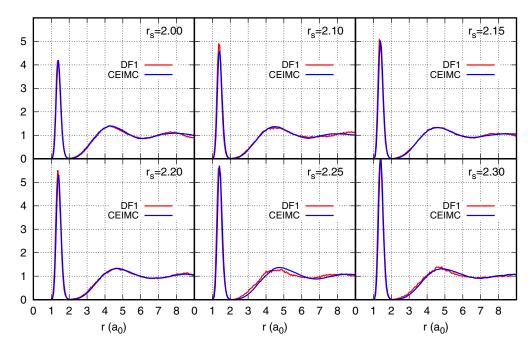


FIG. 6. Proton-proton pair correlation function from CEIMC and from DFT-BOMC along the $T=2000~{\rm K}$ isotherm.

pressure, and Hugoniot. The same corrections are used for both the CEIMC and DFT results.

In Fig. 4 we report the changes in total energy, pressure, and H(T, v). Corrections are small (in particular on the pressure) but on the scale of the Hugoniot [see Fig. 2(a)] a correction of \sim 1 mHa/atom is significant. At higher temperatures, the NQE is unimportant to the Hugoniot.

E. Summary of Hugoniot results

We show in Fig. 5 our computed Hugoniot curve, using the values for the reference point, and we compare with experimental data and previous simulations. The figure also reports our DFT-BOMC points already shown in Fig. 1. VMC and RMC data are rather close to experimental determinations of the Hugoniot line, in particular at low compression and temperature while the deviation is larger at higher compression near the stiffening of the Hugoniot. This stiffening appears when the molecular fraction is small and the nearly fully atomic system becomes less compressible. Our structural analysis, reported in the Appendix A, shows a molecular fraction of 10%–15% in the system at 8000 K along the principal Hugoniot. Conversely at low compression and temperature the system is fully molecular and its electronic configuration (molecular singlet) should be rather simple and easy to model by QMC. Agreement of our results with experimental data is particularly good at T = 2000 K, even better for the VMC estimate than for the RMC one. One cannot exclude the possibility of a residual error in the correction of the RMC results for time step and projection time errors. NQE effects are small and shift the points to higher compression and pressure. In general, our deuterium model appears to be slightly more compressible than experiment with the VMC description being slightly less compressible than the RMC model. This is in line with the trend observed in the previous CEIMC determination of the Hugoniot [12] but our results are closer to the experimental curve, in particular at low compression. Figure 5 also reports the previous CEIMC prediction [12] together with its corrected values from Ref. [13]. Compared to the experimental data, the quality of our present predictions of the Hugoniot at 4000 and 8000 K is equivalent to the Clay et al. [13] fixed note error corrections. However, we note that these points do not agree in terms of absolute compression and pressure.

IV. CONCLUSIONS

We have reported an investigation of the deuterium principal Hugoniot by CEIMC methods. By combining several QMC methods, VMC and RMC, we focused on the low-compression—low-temperature part of the Hugoniot where deuterium is molecular. We also performed a careful study of the cryogenic reference state using both effective model potentials with path-integral Monte Carlo and electronic QMC calculations. We obtained a good agreement with the low-compression experimental Hugoniot while at the higher temperature our predicted Hugoniot remains slightly more compressible than experiment [5]. Our Hugoniot is essentially in agreement with the one from recent first-principles analysis [13] of previous CEIMC calculation [12]. However, compar-

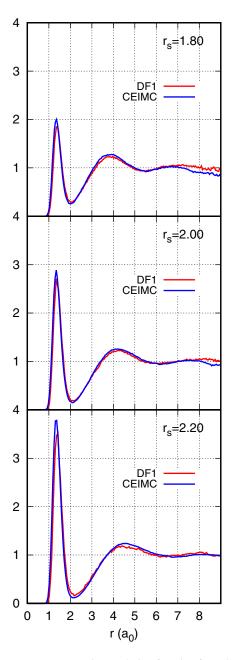


FIG. 7. Proton-proton pair correlation function from CEIMC and from DFT-BOMC along the $T=4000~{\rm K}$ isotherm.

ing predictions at fixed temperature our Hugoniot point has a smaller compression and pressure than from Ref. [13], hence, the two models have different equations of state. The origin of this deviation is unclear and deserves further investigation.

ACKNOWLEDGMENTS

This work has received funding from the European Union's Horizon 2020 research and innovation program under the Grant Agreement No. 676531 (project E-CAM) and the Grant Agreement No. 824158 (project EoCoE 2). D.M.C. was supported by DOE Grant No. NA DE-NA0001789 and by the Fondation NanoSciences (Grenoble). C.P. was supported by the Agence Nationale de la Recherche (ANR) France, un-

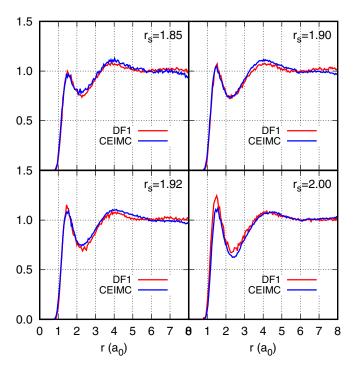


FIG. 8. Proton-proton pair correlation function from CEIMC and from DFT-BOMC along the $T=8000~{\rm K}$ isotherm.

der the program "Accueil de Chercheurs de Haut Niveau" project: HyLightExtreme. Computer time was provided by the PRACE Project 2016143296, ISCRAB (IsB17_MMCRHY) computer allocation at CINECA, Italy, the high-performance computer resources from Grand Equipement National de Calcul Intensif (GENCI) Allocations 2018-A0030910282 and 2019-A0070910282, by an allocation of the Blue Waters sustained petascale computing project, were supported by the National Science Foundation (Award No. OCI 07- 25070) and the State of Illinois, and by the Froggy platform of CIMENT, Grenoble (Rhône-Alpes CPER07-13 CIRA and ANR-10-EQPX-29-01).

APPENDIX A: STRUCTURAL ANALYSIS

In this Appendix we provide some structural analysis along the three isotherms investigated by CEIMC. We start by comparing CEIMC and DFT-BOMC proton-proton correlation functions at the densities reported in Table III. Those comparisons are reported in Figs. 6–8. In all cases we observe a rather good agreement between CEIMC and DFT-BOMC data confirming that the two models provide similar local environment, at least at the two-particle level, as already observed at higher pressure across the liquid-liquid transition line [32]. Figure 6 indicates the fully molecular character of the system along the T = 2000 K isotherm in the investigated density range. At higher temperature we employed the cluster analysis detailed in Ref. [33] to compute the molecular fraction. Results at T = 4000 and 8000 K are shown in Fig. 9. Different estimators for the molecular fraction have been proposed in the literature. In Ref. [33] we proposed an estimator based on the probability of an atom to be paired to the same partner along the entire simulation, called P_p , and we compared to two

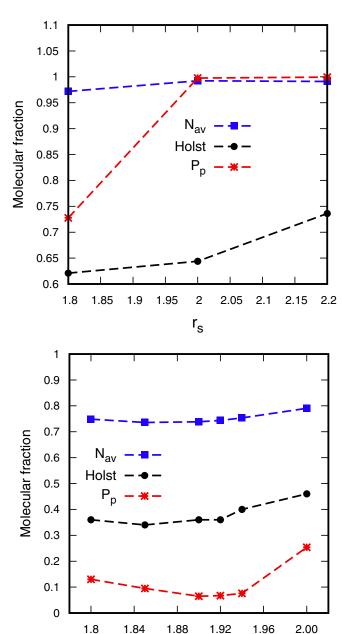


FIG. 9. Molecular fraction from three different estimators for the CEIMC trajectories along the $T=4000~\rm K$ isotherm (upper panel) and the $T=8000~\rm K$ isotherm (lower panel). P_p is the probability for an atom to be paired to the same partner along the entire trajectory, N_{av} the average number of pairs found within a cutoff distance corresponding to the first minimum of $g_{pp}(r)$, and Holst indicates the estimator based on the coordination number at the molecular peak of $g_{pp}(r)$.

 r_s

other estimators, the first one called N_{av} is the average number of molecules found within a cutoff distance corresponding to the first minimum of $g_{pp}(r)$, and the second one is the coordination number at the first maximum of $g_{pp}(r)$ proposed in Ref. [34]. Of the three estimators, only P_p implements the notion of persistence of bonding for well-formed molecules and it was considered a better measure of the molecular fraction in

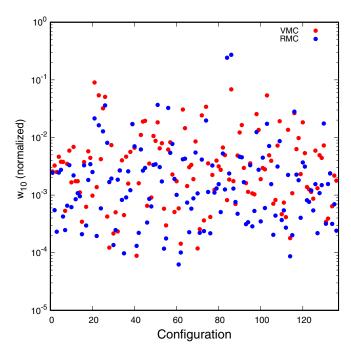


FIG. 10. Normalized, reweighted Boltzmann weight of 136 nuclear configurations for deuterium at T=8000 K and $r_s=1.9$. We can see how the weights of the single configurations generated with CEIMC span several orders of magnitude.

particular in the dissociated regime. Here, we observe that it is between the other two estimators at T=4000 K where $g_{pp}(r)$ has a strong molecular peak, while P_p is rather lower than the other two estimators at T=8000 K where the molecular character of $g_{pp}(r)$ is only marginal. Moreover, as discussed in Ref. [33], even this estimator in the dissociation regime can only be considered an upper bound to the molecular fraction. This analysis shows that the elbow in the Hugoniot, although related, is not determined by molecular dissociation because at T=8000 K at the Hugoniot conditions the molecular dissociation is almost exhausted.

APPENDIX B: SAMPLING CORRECTION

In this Appendix we discuss the possible bias coming from nuclear configurations that have been sampled through a simplified procedure. This is indeed the case in our protocol where nuclear sampling is performed with a not fully optimized VMC procedure and final results are obtained performing fully optimized VMC and RMC calculations for a set of fixed nuclear configurations.

Let us consider the general problem of comparing the average of an observable $O(\mathbf{R})$ for two different models with statistical weight w_0 and w_1 , e.g., corresponding to two different Born-Oppenheimer energy surfaces $w_0 \sim \exp[-\beta V_0(\mathbf{R})]$ and $w_1 \sim \exp[-\beta V_1(\mathbf{R})]$, where β is the inverse temperature. At thermal equilibrium we have

$$\langle \hat{O} \rangle_1 = \frac{\int d\mathbf{R} \, O(\mathbf{R}) w_1}{\int d\mathbf{R} \, w_1} = \frac{\int d\mathbf{R} \, O(\mathbf{R}) w_{10} w_0}{\int d\mathbf{R} \, w_{10} w_0} = \frac{\langle O(\mathbf{R}) w_{10} \rangle_0}{\langle w_{10} \rangle_0},$$
(B1)

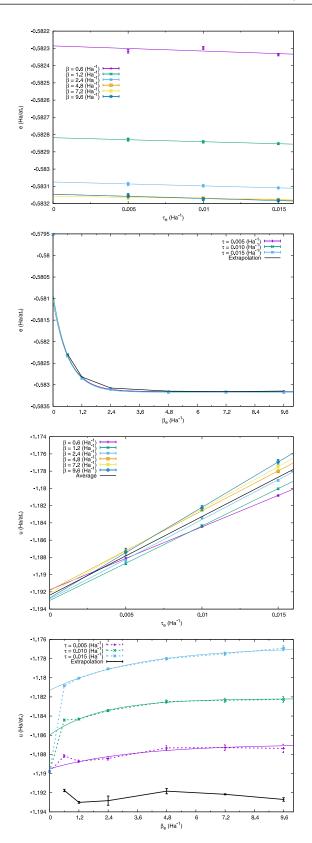


FIG. 11. RMC convergence with respect to τ_e and β_e for total and potential energy.

TABLE V. Total energy, pressure, and Hugoniot averaged over 136 configurations for T = 8000 K and $r_S = 1.85$ and 1.9, obtained from arithmetic means and using reweighting.

$r_s = 1.85$	VMC	Reweight	RMC	Reweight	
E (Ha/at.) -0.5085(2)		-0.5081(3)	-0.5120(2)	-0.5114(3)	
P (a.u.)	0.001533(16)	0.001550(17)	0.001475(16)	0.001518(17)	
H (Ha/at.)	-0.0136(9)	-0.0140(10)	-0.0083(9)	-0.0100(10)	
$r_s = 1.90$	VMC	Reweight	RMC	Reweight	
E (Ha/at.)	-0.5098(2)	-0.5095(4)	-0.5136(2)	-0.5128(3)	
P (a.u.)	0.001295(14)	0.001318(19)	0.001236(13)	0.001266(18)	
H (Ha/at.)	-0.0006(8)	-0.0013(11)	0.0044(7)	0.0036(11)	

where

$$w_{10} = \frac{w_1}{w_0} = e^{-\beta[V_1(\mathbf{R}) - V_0(\mathbf{R})]}.$$
 (B2)

Stochastically sampling the configurations in continuum space within Monte Carlo methods the averages are estimated by

$$\langle \hat{O} \rangle_0 \simeq \frac{\sum_i O(\mathbf{R}_i)}{\mathcal{N}},$$
 (B3)

where the set of configurations $\{\mathbf{R}_i, i=1, \mathcal{N}\}$ is extracted with probability proportional to w_0 . An unbiased estimate of averages for the other model Hamiltonian corresponding to weight w_1 is then obtained by reweighting

$$\langle \hat{O} \rangle_1 \simeq \frac{\sum_i O(\mathbf{R}_i) w_{10}(\mathbf{R}_i)}{\sum_i w_{10}(\mathbf{R}_i)}.$$
 (B4)

Although formally exact, this procedure is not useful if the weights are wildly varying [note the extensive character of the exponent in Eq. (B2)]: for a finite set of configurations only few will dominate the sums. This is the case when reweighting nuclear configurations generated during the CEIMC sampling with their proper weight either from fully optimized VMC (O-VMC) or from RMC. An example is given in Fig. 10 where for 136 different nuclear configurations we report both the weights from O-VMC and RMC. It is, however, possible to introduce a cutoff to exclude outliers, i.e., configurations with a disproportionately large statistical weight, that would otherwise dominate the whole reweighted sampling. By doing so we have recomputed energy, pressure, and the Hugoniot for two systems at T = 8000 K, at $r_s = 1.85$ and 1.90. We show our results in Table V. We can see that even if there are a few

small differences in the energies and pressures, the results are largely compatible. Moreover, we see that the estimates for the hugoniot are well within error bars. This means that CEIMC is able to provide a sample of configurations that can be used to accurately describe the system even after wave-function optimization and projection in imaginary time, corroborating the overall robustness of our method.

APPENDIX C: CONVERGENCE OF THE RMC CALCULATIONS

In this last Appendix we report convergence tests for our RMC calculations. In RMC results for finite imaginary-time step (τ_e) and finite projection in imaginary time (β_e) need to be extrapolated to the limits $\tau_e \to 0$, $\beta_e \to \infty$. In Fig. 11 we report, for a single nuclear configuration, total and potential energy dependence on τ_e for various β_e and on β_e for various τ_e . As for the total energy we see a very small dependence on τ_e and an exponential decaying behavior of $e(\beta_e)$ as expected. Potential energy is more cumbersome. First, we observe a strong τ_e linear dependence at fixed β_e with the linear slope slightly depending on β_e . When plotting $u(\beta_e, \tau_e)$ vs β_e for various τ_e we observe a growing exponential behavior at large β_e and a nonmonotonous behavior at short β_e . This procedure needs to be performed for all twists and all different nuclear configurations before averaging. It is one of the most delicate points of our procedure since the convergence of the potential energy propagates to the pressure estimator. We note that the extrapolations introduce an important source of systematic bias of the RMC results, notably for the pressure, which is absent in the corresponding VMC calculations.

^[1] J. M. McMahon, M. A. Morales, C. Pierleoni, and D. M. Ceperley, Rev. Mod. Phys. 84, 1607 (2012).

^[2] N. C. Holmes, M. Ross, and W. J. Nellis, Phys. Rev. B **52**, 15835 (1995).

^[3] G. V. Boriskov, A. I. Bykov, R. I. Il'kaev, V. D. Selemir, G. V. Simakov, R. F. Trunin, V. D. Urlin, A. N. Shuikin, and W. J. Nellis, Phys. Rev. B 71, 092104 (2005).

^[4] M. D. Knudson, D. L. Hanson, J. E. Bailey, C. A. Hall, J. R. Asay, and W. W. Anderson, Phys. Rev. Lett. 87, 225501 (2001).

^[5] M. D. Knudson and M. P. Desjarlais, Phys. Rev. Lett. 118, 035501 (2017).

^[6] D. G. Hicks, T. R. Boehly, P. M. Celliers, J. H. Eggert, S. J. Moon, D. D. Meyerhofer, and G. W. Collins, Phys. Rev. B 79, 014112 (2009).

^[7] K. Falk, S. Regan, J. Vorberger, M. Barrios, T. Boehly, D. Fratanduono, S. Glenzer, D. Hicks, S. Hu, C. Murphy, P. Radha, S. Rothman, A. Jephcoat, J. Wark, D. Gericke, and G. Gregori, High Energy Density Phys. 8, 76 (2012).

^[8] K. Falk, S. P. Regan, J. Vorberger, B. J. B. Crowley, S. H. Glenzer, S. X. Hu, C. D. Murphy, P. B. Radha, A. P. Jephcoat, J. S. Wark, D. O. Gericke, and G. Gregori, Phys. Rev. E 87, 043112 (2013).

- [9] M. D. Knudson, M. P. Desjarlais, A. Becker, R. W. Lemke, K. R. Cochrane, M. E. Savage, D. E. Bliss, T. R. Mattsson, and R. Redmer, Science 348, 1455 (2015).
- [10] W. J. M. Rankine, Philos. Trans. R. Soc. London 160, 277 (1870).
- [11] W. Nellis, Rep. Prog. Phys. 69, 1479 (2006).
- [12] N. M. Tubman, E. Liberatore, C. Pierleoni, M. Holzmann, and D. M. Ceperley, Phys. Rev. Lett. 115, 045301 (2015).
- [13] R. C. Clay, M. P. Desjarlais, and L. Shulenburger, Phys. Rev. B 100, 075103 (2019).
- [14] M. D. Knudson, D. L. Hanson, J. E. Bailey, C. A. Hall, J. R. Asay, and C. Deeney, Phys. Rev. B 69, 144209 (2004).
- [15] D. Ceperley, Rev. Mod. Phys. 67, 279 (1995).
- [16] S. Baroni and S. Moroni, Phys. Rev. Lett. 82, 4745 (1999).
- [17] P. Giannozzi, S. Baroni, N. Bonini, M. Calandra, R. Car, C. Cavazzoni, D. Ceresoli, G. L. Chiarotti, M. Cococcioni, I. Dabo, A. Dal Corso, S. de Gironcoli, S. Fabris, G. Fratesi, R. Gebauer, U. Gerstmann, C. Gougoussis, A. Kokalj, M. Lazzeri, L. Martin-Samos *et al.*, J. Phys.: Condens. Matter 21, 395502 (2009).
- [18] P. Giannozzi, O. Andreussi, T. Brumme, O. Bunau, M. B. Nardelli, M. Calandra, R. Car, C. Cavazzoni, D. Ceresoli, M. Cococcioni, N. Colonna, I. Carnimeo, A. D. Corso, S. de Gironcoli, P. Delugas, R. A. DiStasio, Jr., A. Ferretti, A. Floris, G. Fratesi, G. Fugallo *et al.*, J. Phys.: Condens. Matter 29, 465901 (2017).
- [19] R. P. Feynman and M. Cohen, Phys. Rev. 102, 1189 (1956).

- [20] D. M. Ceperley and B. J. Alder, Phys. Rev. B 36, 2092 (1987).
- [21] M. Holzmann, D. M. Ceperley, C. Pierleoni, and K. Esler, Phys. Rev. E 68, 046707 (2003).
- [22] C. Pierleoni, K. T. Delaney, M. A. Morales, D. M. Ceperley, and M. Holzmann, Comput. Phys. Commun. 179, 89 (2008).
- [23] C. Pierleoni and D. Ceperley, *Lecture Notes in Physics*, Vol. 703 (Springer, Berlin, 2006), pp. 641–683.
- [24] C. Pierleoni, M. A. Morales, G. Rillo, M. Holzmann, and D. M. Ceperley, Proc. Natl. Acad. Sci. U. S. A. 113, 4954 (2016).
- [25] E. Liberatore, M. A. Morales, D. M. Ceperley, and C. Pierleoni, Mol. Phys. 109, 3029 (2011).
- [26] I. F. Silvera and V. V. Goldman, J. Chem. Phys. 69, 4209 (1978).
- [27] W. Kolos and L. Wolniewicz, J. Chem. Phys. 41, 3674 (1964).
- [28] M. Holzmann, R. C. Clay, M. A. Morales, N. M. Tubman, D. M. Ceperley, and C. Pierleoni, Phys. Rev. B 94, 035126 (2016).
- [29] I. Silvera, Rev. Mod. Phys. 52, 393 (1980).
- [30] P. C. Sauers, *Hydrogen Properties for Fusion Energy* (University of California Press, Berkeley, 1986).
- [31] J. P. Perdew, K. Burke, and M. Ernzerhof, Phys. Rev. Lett. 77, 3865 (1996).
- [32] V. Gorelov, C. Pierleoni, and D. M. Ceperley, Contrib. Plasma Phys. 59, 1 (2019).
- [33] C. Pierleoni, M. Holzmann, and D. M. Ceperley, Contrib. Plasma Phys. **58**, 99 (2018).
- [34] B. Holst, R. Redmer, and M. Desjarlais, Phys. Rev. B 77, 184201 (2008).