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Systematic study of finite-size effects in quantum Monte Carlo calculations of real metallic systems

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We present a systematic and comprehensive study of finite-size effects in diffusion quantum Monte Carlo calculations of metals. Several previously introduced schemes for correcting finite-size errors are compared for accuracy and efficiency, and practical improvements are introduced. In particular, we test a simple but efficient method of finite-size correction based on an accurate combination of twist averaging and density functional theory. Our diffusion quantum Monte Carlo results for lithium and aluminum, as examples of metallic systems, demonstrate excellent agreement between all of the approaches considered. © 2015 AIP Publishing LLC. [http://dx.doi.org/10.1063/1.4922619]

I. INTRODUCTION

Density functional theory (DFT) has dominated atomicscale materials modeling for the past three decades and will continue to be extremely important. However, there are plenty of problems where the accuracy of DFT falls short of requirements. There are clear reasons to expect DFT to struggle in strongly correlated solids, but these are not the only systems for which DFT is insufficient. Take, for example, the problem of distinguishing between molecular crystal phases and competing low-energy polymorphs. Even in relatively simple molecular solids such as crystalline benzene and its polymorphs under pressure, the energy differences of interest are less than a few kJ/mol. The most successful calculations based on DFT are only reliable to $\sim 10 \text{ kJ/mol}$,¹ and it has recently been shown that the use of *ab initio* many-electron wavefunction methods, such as quantum Monte Carlo (QMC), is essential to tackle this problem successfully.² Unlike DFT, many-electron wavefunction methods can, in principle, be improved systematically until the required convergence is obtained.

Another important example is the adsorption of molecules on surfaces, where DFT is sometimes unable to give predictions of useful accuracy. DFT values of surface formation energies of simple paradigmatic materials such as silicon and magnesium oxide depend strongly on the assumed exchange-correlation functional, and there is usually no way of knowing in advance which functional to trust. The well-known problem of calculating electronic band gaps could also be mentioned.

The urgent practical need to go beyond DFT in these and other areas is driving current efforts to develop more accurate methods. There is abundant evidence that there are large classes of problems for which QMC techniques, in particular diffusion Monte Carlo (DMC), are considerably more accurate than DFT.^{3–6} Just recently, using QMC methods, chemically accurate ionization potentials have been obtained for the first-row transition-metal atoms with a mean absolute error of only 0.126 kcal/mol.⁷ By combining high accuracy with good efficiency and scalability, QMC methods promise to bring high accuracy to computational materials science as a matter of routine.⁸

QMC simulations of extended systems are carried out using finite simulation cells subject to periodic boundary conditions. Practical and computational constraints restrict the size of the simulation cell and so introduce finite-size (FS) errors, which can be large and are one of the main problems holding back the application of accurate QMC techniques to solids.^{9,10} Quantifying and correcting these errors is an essential part of all QMC simulations of extended systems, particularly when high accuracy is required.

FS errors affect independent-particle approaches such as DFT as well as many-body approaches such as QMC. For calculations of perfect crystals, DFT FS errors can be reduced simply by improving the accuracy of the Brillouin zone integration, although the errors arise when periodic supercells are used to model aperiodic systems which are less easily dealt with. Independent-particle FS errors also affect many-body calculations of perfect crystals¹³ and can be reduced using twist averaging, which is the many-electron equivalent of Brillouin zone integration. Even after twist averaging, however, "many-body" FS errors with no independent-particle analogues remain.

Another important contribution to the FS error in manybody simulations of extended systems arises from the treatment of the potential energy. The 1/r Coulomb interaction is inconsistent with the periodicity of the simulation cell and has to be replaced by the Ewald interaction, which is the Green's function of Poisson's equation subject to periodic boundary conditions. Unlike the Coulomb interaction, the Ewald interaction depends on the size and shape of the simulation cell, leading to additional finite-size errors.¹⁴ One approach to circumventing this problem is to use a different periodic function, the "model periodic Coulomb" (MPC) interaction, in place of the Ewald interaction.^{14,16} Variational quantum Monte Carlo (VMC)^{20,21} simulations using the MPC

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interaction suffer from smaller FS effects than simulations using the standard Ewald interaction. It has also been shown that using the MPC interaction reduces the FS errors in DMC calculations of ground and excited states.¹⁷

A drawback of the MPC approach is that it only reduces FS errors arising from the use of the Ewald interaction. The charge density and exchange-correlation hole in a finite simulation cell are often very similar to those of an infinite solid, so the errors in the Coulomb energy are indeed primarily due to the errors in the interaction, but the imposition of periodic boundary conditions also affects the many-electron wavefunction and thus the electronic kinetic energy. The non-interacting part of the FS error in the kinetic energy may be eliminated by twist averaging, but the many-body contributions are not negligible.

Under the assumption that the low-k behaviour of the structure factor is independent of the choice of simulation cell, Chiesa *et al.*¹⁵ proposed a method to estimate the manybody contributions to the FS errors in both the potential and kinetic energies without abandoning the Ewald interaction. Employing this correction, which is based on the random-phase approximation at long wavelength, one can calculate FS corrections within a single simulation.

Another approach to the treatment of many-body finitesize errors is provided by the Kwee-Zhang-Krakauer (KZK) functional,¹⁹ which adds a correction computed from the difference between the DFT energy evaluated using the local density approximation (LDA) for an infinite system and the DFT energy evaluated using a modified LDA specifically designed to reproduce the total energy of the finite simulation cell, including FS errors. Both the standard LDA and the KZK LDA are parameterized on the basis of DMC simulations of cells of uniform electron gas subject to periodic boundary conditions, but the standard LDA uses DMC energies that have been extrapolated to infinite cell size while the KZK LDA does not.

In this paper, we systematically study the problem of eliminating FS errors from QMC calculations of real metallic systems, taking lithium and aluminum as examples. We analyze twist-averaged DMC energies obtained using the Ewald interaction and the MPC interaction,^{14,16} and finite-size corrections based on the Chiesa formalism¹⁵ and the KZK functional.¹⁹ We also investigate DFT-based corrections designed to improve imperfectly twist-averaged results and consider how best to combine the use of twist-averaged boundary conditions¹⁸ with the KZK functional.¹⁹

II. COMPUTATIONAL DETAILS

A. Diffusion quantum Monte Carlo calculations

The diffusion quantum Monte Carlo method is a stochastic technique for obtaining the ground-state energy of a manyelectron system. DMC has been described in many previous papers^{9,10} and will not be discussed in detail here, but since this work is focused on technical aspects of DMC simulations we start with a brief explanation.

The DMC algorithm solves the imaginary-time Schrödinger equation,

$$\frac{\partial \Psi(\mathbf{R},\tau)}{\partial \tau} = \frac{1}{2} \sum_{i=1}^{N_e} \nabla_{\mathbf{r}_i}^2 \Psi(\mathbf{R},\tau) - (V(\mathbf{R}) - E_T) \Psi(\mathbf{R},\tau), \qquad (1)$$

where $\mathbf{R} = (\mathbf{r}_1, \mathbf{r}_2, \dots, \mathbf{r}_{N_e})$ is a $3N_e$ -dimensional vector defining the positions of all N_e electrons in the simulation cell, τ is the imaginary time (a real variable despite its name), $V(\mathbf{R})$ is the potential energy including electron-electron interactions, and E_T is a constant energy offset. (We work in Hartree atomic units, where the numerical values of \hbar , e, m_e , and $4\pi\varepsilon_0$ are all equal to 1.) The imaginary-time Schrödinger equation resembles a $3N_e$ -dimensional diffusion equation with diffusion constant D = 1/2. The potential energy term causes the diffusers to "branch" (multiply or die out) at a position-dependent rate. The wavefunction $\Psi(\mathbf{R},\tau)$ is the number density of diffusers, which are normally known as walkers or configurations and are points in the $3N_e$ dimensional configuration space, not individual electrons. The DMC algorithm uses this simple physical interpretation to simulate the imaginary-time evolution of the wavefunction using a finite population of diffusing and branching walkers.

Solving the imaginary-time Schrödinger equation is useful because it projects out the ground state as $\tau \to \infty$. If the initial wavefunction is expanded as a linear combination of energy eigenfunctions, $\Psi(\tau = 0) = \sum_i c_i \Psi_i$, the solution of the imaginary-time Schrödinger equation $\partial \Psi / \partial \tau = -(\hat{H} - E_T)\Psi$ is

$$\Psi(\tau) = \sum_{i} c_i e^{-(E_i - E_T)\tau} \Psi_i.$$
 (2)

Thus, as long as $c_0 \neq 0$, the wavefunction $\Psi(\tau)$ becomes proportional to Ψ_0 as $\tau \to \infty$. By gradually adjusting E_T to maintain the normalization of the solution in the large τ limit, we can find the ground-state energy E_0 .

An obvious difficulty with this approach is that the wavefunction $\Psi(\mathbf{R}, \tau)$, which is not necessarily positive, is interpreted as a walker density, which must be positive. In fact, a naive application of the DMC algorithm to a many-electron system yields a totally symmetric many-boson ground state of no physical interest. The fixed-node approximation introduces a trial many-electron ground-state wavefunction, $\Psi_T(\mathbf{R})$, and forbids walker moves that cause Ψ_T to change sign. As long as Ψ_T is properly antisymmetric, this is sufficient to ensure that a fermionic solution is obtained. It may be shown^{9,11} that energies calculated within the fixed-node approximation are variational: the result is greater than or equal to the many-fermion ground-state energy and tends to the exact energy as the $(3N_e - 1)$ -dimensional nodal surface on which $\Psi_T = 0$ tends to the ground-state nodal surface. The fixednode approximation is required for DMC simulations of large systems but is the only fundamental limitation of the method. Other approximations, such as the use of a finite time step or the representation of ions by pseudopotentials, can be made negligible or avoided given sufficient computer time. Fixednode DMC energies are in most cases comparable in accuracy to energies calculated using the coupled-cluster single double (triple) (CCSD(T)) method, 12 which is often known as the "gold standard" of quantum chemistry.

The diffusion/branching simulation described above is unstable in practice because the potential energy $V(\mathbf{R})$ diverges

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whenever electrons approach nuclei or each other, leading to uncontrollable branching. This problem can be overcome using an importance-sampling technique. The imaginary-time Schrödinger equation is re-expressed in terms of the quantity $f(\mathbf{R}, \tau) = \Psi_T(\mathbf{R})\Psi(\mathbf{R}, \tau)$ to obtain

$$\frac{\partial f(\mathbf{R},\tau)}{\partial t} = \frac{1}{2} \nabla_{\mathbf{R}}^2 f(\mathbf{R},\tau) - \nabla_{\mathbf{R}} \cdot [\mathbf{v}(\mathbf{R})f(\mathbf{R},\tau)] - [E_L(\mathbf{R}) - E_T]f(\mathbf{R},\tau),$$
(3)

where $\nabla_{\mathbf{R}} = (\nabla_{\mathbf{r}_1}, \nabla_{\mathbf{r}_2}, \dots, \nabla_{\mathbf{r}_{N_e}})$ is the $3N_e$ -dimensional gradient operator, $\nabla_{\mathbf{R}}^2 = \nabla_{\mathbf{R}} \cdot \nabla_{\mathbf{R}}$ is the corresponding Laplacian, $\mathbf{v}(\mathbf{R}) = \nabla_{\mathbf{R}} \ln |\Psi_T(\mathbf{R})|$ is the $3N_e$ -dimensional drift velocity vector, and $E_L(\mathbf{R}) = (1/\Psi_T(\mathbf{R}))\hat{H}\Psi_T(\mathbf{R})$ is the local energy. The importance-sampled imaginary-time Schrödinger equation describes a diffusion process similar to that discussed above, except that the walkers now drift with velocity $\mathbf{v}(\mathbf{R})$ as well as diffusing and branching. The branching rate is determined by the shifted local energy $E_L(\mathbf{R}) - E_T$ instead of the shifted potential energy $V(\mathbf{R}) - E_T$. If the trial function is a good approximation to the ground state, the local energy is a smooth function of \mathbf{R} , and the numerical difficulties caused by divergences in $V(\mathbf{R})$ are avoided. The fixed-node approximation is imposed by rejecting walker moves that change the sign of $\Psi_T(\mathbf{R})$.

Our DMC simulations used the CASINO QMC code²² and a trial function of Slater-Jastrow (SJ) form,

$$\Psi_T(\mathbf{R}) = \exp[J(\mathbf{R})] \det[\psi_n(\mathbf{r}_i^{\mathsf{T}})] \det[\psi_n(\mathbf{r}_i^{\mathsf{T}})], \qquad (4)$$

where \mathbf{r}_i^{\uparrow} is the position of the i-th spin-up electron, $\mathbf{r}_i^{\downarrow}$ is the position of the j-th spin-down electron, $\exp[J(\mathbf{R})]$ is the Jastrow factor, and det[$\psi_n(\mathbf{r}_i^{\uparrow})$] and det[$\psi_n(\mathbf{r}_i^{\downarrow})$] are Slater determinants of spin-up and spin-down one-electron orbitals, respectively. These orbitals were obtained from DFT calculations using the plane-wave-based Quantum Espresso code.²³ A norm-conserving pseudopotential constructed within DFT using the Perdew-Zunger parameterization of the local density approximation²⁴ was employed. We chose a very large basisset cutoff of 300 Ry to guarantee converge to the complete basis-set limit.²⁵ The one-electron orbitals, originally expressed as linear combinations of plane waves, were transformed into a blip polynomial basis for efficiency.²⁶ The Jastrow function $J(\mathbf{R})$ consisted of polynomial one-body electron-nucleus (en) and two-body electron-electron (ee) terms, the parameters of which were optimized by variance minimization at the variational Monte Carlo level.²⁷⁻³⁰

B. Finite-size errors and correction methods

QMC FS errors are conventionally separated into onebody and many-body contributions. One-body (independentparticle) errors arise from the non-interacting kinetic, potential, and Hartree energies and include shell-filling effects. These errors can be removed by twist averaging.¹⁸ Manybody errors arise from the effects of exchange and correlation on the Coulomb and kinetic energies and are not removed by twist averaging. As explained in the Introduction, various techniques may be used to reduce or cancel these errors, but none is entirely successful and care is required. The oldest approach is extrapolation, which remains useful. The use of the modified periodic Coulomb interaction^{14,16,17} reduces the Coulomb errors but not the kinetic energy errors and must therefore be combined with other techniques. The LDA-based KZK approach¹⁹ applies corrections obtained from DFT calculations carried out using a modified exchange-correlation functional explicitly designed to mimic the DMC many-body errors.

To remove single-particle errors and eliminate shell effects in the kinetic energies of metallic systems, we use twist-averaged boundary conditions.¹⁸ A twist \mathbf{k}_s is imposed by insisting that the many-electron wavefunction $\Psi_{\mathbf{k}_s}$ obeys the Bloch boundary condition

$$\Psi_{\mathbf{k}_{s}}(\mathbf{r}_{1},\ldots,\mathbf{r}_{i}+\mathbf{L},\ldots,\mathbf{r}_{N_{e}})$$

= exp(*i***k**_s · **L**) $\Psi_{\mathbf{k}_{s}}(\mathbf{r}_{1},\ldots,\mathbf{r}_{i},\ldots,\mathbf{r}_{N_{e}})$ (5)

for all electrons *i*, where **L** is any simulation-cell lattice vector. Expectation values of observables are obtained by averaging over twist vectors \mathbf{k}_s uniformly distributed over the simulation-cell Brillouin zone,

$$\langle \widehat{O} \rangle = \frac{1}{N_{\text{twist}}} \sum_{\mathbf{k}_s} \langle \Psi_{\mathbf{k}_s} | \widehat{O} | \Psi_{\mathbf{k}_s} \rangle.$$
(6)

The twists can be chosen from a uniform Monkhorst-Pack grid,³¹ preferably offset from Γ , or can be chosen randomly, as in this work. The number of twists should be as large as computational resources allow.

As the twist \mathbf{k}_s varies, the energies of some of the oneelectron states appearing in the Slater determinants may cross the Fermi level. In the canonical approach to twist averaging, the electron number is kept constant and the Fermi level is allowed to vary with twist. This makes the twist-averaged total energy slightly too large,^{10,18} but the bias reduces as the simulation-cell increases in size and is normally negligible. In the grand canonical approach to twist averaging, the Fermi energy is fixed and the electron number is allowed to vary with \mathbf{k}_s . As was demonstrated in Ref. 10, energies obtained using grand-canonical twist averaging exhibit much larger fluctuations than energies obtained using canonical twist averaging with the same number of twists. Furthermore, these fluctuations die away very slowly as the number of twists is increased. To save effort, applications of QMC to real systems normally use the smallest number of twists possible, so canonical twist averaging is preferable despite the fact that it suffers from small systematic errors. This work only considers twist averaging within the canonical ensemble.

In metallic systems, even when substantial computational resources are expended, the FS errors due to incomplete twist averaging are substantial. We therefore define an incompletetwist-averaging correction as follows:

$$\Delta_{BZ} = E^{DFT}(\infty) - E^{DFT}_{TAV}(L), \tag{7}$$

where $E^{DFT}(\infty)$ is the DFT energy computed using a fully converged *k*-point mesh, and

$$E_{TAV}^{DFT}(L) = \frac{1}{N_{\text{twist}}} \sum_{\mathbf{k}_s} E^{DFT}(L, \mathbf{k}_s)$$
(8)

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is the twist-averaged DFT energy obtained using the same simulation cell and set of twists as the DMC simulation. The incomplete-twist-averaging correction tends to zero as the DMC twist averaging is improved and works well if the independent-particle finite-size errors are well approximated by their DFT equivalents. In practice, this approach allows accurate results to be obtained with surprisingly small sets of DMC twists, even in metals.

We analyze three different methods for correcting the many-body FS errors in DMC results. Two of these use the structure-factor-based corrections proposed by Chiesa *et al.*^{10,15} The first employs the standard Ewald form of the periodic Coulomb interaction and Chiesa corrections for both the kinetic and potential energies; the second uses the MPC^{14,16,17} to deal with the Coulomb errors and a Chiesa correction for the kinetic energy only. Results obtained with both of these methods are expected to be similar in quality.¹⁰

The third FS-correction method considered here is the KZK approach,¹⁹ which uses a system-size-dependent local density approximation fitted to the results of DMC simulations of *finite* cubic simulation cells of uniform electron gas. DFT energies calculated using the KZK functional incorporate DMC FS errors within an approximation analogous to the LDA. To estimate the FS error in the DMC total energy of a given simulation cell, the DFT total energy of exactly the same simulation cell is calculated using the KZK functional. The difference between this value and the DFT energy of an infinite simulation cell calculated using the standard LDA provides an estimate of the DMC FS error. The KZK functional was not originally combined with twist averaging, but the combination is easy to implement (see below) and very successful.

In the following, we explain how to combine twist averaging and KZK corrections. In general, any FS correction can be written as

$$\Delta E^{FS}(L) = \Delta_{1B}^{FS}(L) + \Delta_{MB}^{FS}(L), \qquad (9)$$

where $\Delta_{1B}^{FS}(L)$ includes contributions from the Hartree energy, the electron-nuclear Coulomb interaction energy, and the onebody component of the kinetic energy, while $\Delta_{MB}^{FS}(L)$ is a manybody term that includes contributions from the exchangecorrelation energy and the many-body part of the kinetic energy. More precisely, $\Delta_{1B}^{FS}(L)$ may be defined as that part of the total finite-size error that is also present in a DFT calculation for the same simulation cell and can be corrected using DFT results.

In their original paper,¹⁹ Kwee, Zhang, and Krakauer considered the finite-size errors affecting a QMC simulation carried out in a supercell of $L \times L \times L$ primitive unit cells with twist $\mathbf{k}_s = \mathbf{0}$. The corresponding one-particle finite-size error is

$$\Delta_{1B}^{FS}(L) = E^{DFT}(\infty) - E^{DFT}(L), \qquad (10)$$

where $E^{DFT}(\infty)$ is the DFT energy obtained using a fully converged *k*-point mesh and $E^{DFT}(L)$ is the Γ -point DFT energy of the supercell. This, of course, can be calculated using an $L \times L \times L$ Monkhorst-Pack grid of *k* points in the primitive Brillouin zone. Since $\mathbf{k}_s = \mathbf{0}$, the Monkhorst-Pack grid includes the origin. The KZK approximation to the many-body finite-size error is

$$\Delta_{MB}^{FS}(L) \approx E^{DFT}(L) - E^{KZK}(L), \qquad (11)$$

where $E^{KZK}(L)$ is the Γ -point DFT energy of the supercell computed using the KZK functional instead of the standard LDA. The KZK approximation to the total finite-size error is

$$\Delta E^{FS}(L) = \Delta_{1B}^{FS}(L) + \Delta_{MB}^{FS}(L) \approx E^{DFT}(\infty) - E^{KZK}(L).$$
(12)

If twist averaging is used, the DMC energy becomes a function of the twist \mathbf{k}_s , which lies in the small Brillouin zone corresponding to the simulation supercell. The Slater determinants appearing in the twisted trial wavefunction are built using orbitals from a Monkhorst-Pack grid of $L \times L \times L k$ points within the larger primitive Brillouin zone, offset by \mathbf{k}_s from the origin. In a DFT context, carrying out a supercell calculation at a non-zero twist \mathbf{k}_s is equivalent to approximating the integration over the primitive Brillouin zone by a quadrature over this offset grid of k points.

To help analyze the FS errors, we write the DMC groundstate energy of the infinite simulation cell as

$$E^{DMC}(\infty) \approx E^{DMC}_{TAV}(L) + \Delta E^{FS}_{TAV}(L), \qquad (13)$$

where

$$E_{TAV}^{DMC}(L) = \frac{1}{N_{\text{twist}}} \sum_{\mathbf{k}_s} E^{DMC}(L, \mathbf{k}_s)$$
(14)

is the twist-averaged DMC energy of the $L \times L \times L$ simulation cell and $\Delta E_{TAV}^{FS}(L)$ is the required FS correction. In the spirit of KZK, this is approximated using the formula

$$\Delta E_{TAV}^{FS}(L) \approx E^{DFT}(\infty) - E_{TAV}^{KZK}(L), \tag{15}$$

where $E^{DFT}(\infty)$ is the DFT energy computed within the LDA using a fully converged *k*-point mesh (which in this work means $28 \times 28 \times 28$) and

$$E_{TAV}^{KZK}(L) = \frac{1}{N_{\text{twist}}} \sum_{\mathbf{k}_s} E^{KZK}(L, \mathbf{k}_s)$$
(16)

is the twist-averaged KZK energy for the supercell, computed using the same set of N_{twist} twists employed in the DMC simulations. The FS correction, $\Delta E_{TAV}^{FS}(L)$, accounts both for the many-body FS errors and for any one-body FS errors not removed by the limited twist averaging employed in the DMC simulations.

The use of twisted boundary conditions requires the use of complex trial wavefunctions and increases the computational cost a little because complex arithmetic is slower than real arithmetic. In the VMC and wavefunction optimization algorithms, since the expectation values of Hermitian operators must be real, only the real parts of the local-energy components need to be calculated and collected. The run-time and programming-time costs of twist averaging are therefore small. The use of a complex trial function in DMC requires the replacement of the fixed-node approximation, in which the DMC wavefunction, by the fixed-phase approximation,³⁵ in which the DMC and trial wavefunctions are constrained to have the same phase. In practice, however, the fixed-node and fixed-phase algorithms are very similar and little extra

TABLE I. DMC energies of metallic lithium for different numbers N of atoms in the simulation cell. Every energy appearing in the table is the outcome of a single Γ -point DMC simulation for the appropriate simulation cell. Results obtained by applying Chiesa kinetic (ΔKE) and potential (ΔPE) finite-size corrections to DMC energies calculated using the Ewald interaction agree well with results obtained by applying only the Chiesa kinetic correction to DMC energies calculated using the modified periodic Coulomb interaction. Despite the application of many-body finite-size corrections, the calculated energy depends strongly on the size of the simulation cell. This indicates that the single-particle finite-size errors are large. Energies are in eV per atom.

N	Ewald	Ewald + ΔKE	Ewald + ΔPE	Ewald + $\Delta KE + \Delta PE$	MPC	$MPC + \Delta KE$
32	-6.943 07(3)	-6.92246(3)	-6.874 50(3)	-6.853 89(3)	-6.862 19(4)	-6.841 57(4)
48	-6.97920(7)	-6.97852(7)	-6.917 29(7)	-6.91661(7)	-6.91661(6)	-6.915 93(6)
72	-6.98253(3)	-6.979 81(3)	-6.94471(3)	-6.94205(3)	-6.940 62(3)	-6.937 90(3)
96	-6.97063(5)	-6.96845(5)	-6.94015(5)	-6.93804(5)	-6.943 82(5)	-6.94171(5)
144	-6.89491(2)	-6.890 89(2)	-6.87634(2)	-6.87232(2)	-6.87640(2)	-6.87246(2)

coding is required: the real part of the drift vector is used when proposing trial electron moves; it is neither necessary nor possible to reject node-crossing electron moves, and, as in VMC, only the real parts of the local energies are gathered. Another important issue in twist averaging is the Jastrow factor. This work uses the same optimized Jastrow for each twist vector, as we found that re-optimizing the Jastrow factor at every twist provides negligible improvements in the final results.³⁶ We note, finally, that the VMC or DMC runs at each twist can be relatively short and need not be fully converged. The idea is that we collect enough data to achieve an acceptable error bar when the data are averaged over all twist vectors. If a normal run without twist averaging takes *N* moves to arrive at an acceptable error bar, each twist angle needs only to be run for around N/N_{twist} moves.

III. RESULTS AND DISCUSSION

This section presents DMC results obtained using the three different FS-correction methods explained in the Sec. II B. As simple example metals, we have studied lithium (Li) and aluminum (Al), with one and three valence electrons, respectively. The frozen ionic cores are represented by non-local norm-conserving LDA pseudopotentials. The KZK functional is essentially a LDA, so the use of LDA pseudopotentials allows us to obtain a consistent comparison of all three finite-size-correction approaches considered. There is evidence that Hartree-Fock pseudopotentials when used in DMC simulations, but since our aim is to investigate FS errors, and since these are almost independent of pseudopotential, no advantage would be gained by using another pseudopotential type. To check the accuracy and convergence of the DMC energy as a function of the number of atoms N in the simulation cell, we have performed calculations for a range of different values of N (and thus also different values of L).

We first investigate the effects of applying Chiesa and MPC corrections to the results of Γ -point DMC simulations with no twist averaging. Table I shows the Γ-point DMC results for Li obtained using various different FS correction methods. As expected,¹⁰ results (denoted Ewald + ΔKE $+\Delta PE$) obtained by adding Chiesa kinetic and potential energy corrections to the DMC energy calculated using the Ewald interaction are in good agreement with results (denoted MPC + Δ KE) obtained using the modified periodic Coulomb interaction with a Chiesa correction for the kinetic energy only. Note that the higher-order kinetic energy corrections defined according to Eq. (55) in Ref. 10 are included in ΔKE . Because of the lack of twist averaging, the single-body FS errors are large and the calculated ground-state energies depend strongly on the size of the simulation cell. The choice of the Γ -point, $\mathbf{k}_s = 0$, maintains the symmetry of the system but usually increases shell-filling effects in metallic systems, making the independent-particle FS errors even worse. It is clear, however, that no calculation carried out at a single twist vector will yield satisfactorily accurate results. The use of twist averaging is essential in metals.

Tables II and III present twist-averaged DMC results for Li and Al, respectively, again corrected using the Chiesa and MPC approaches. The integration over the simulation-cell

TABLE II. DMC energies of lithium for different numbers *N* of atoms in the simulation cell. Every energy appearing in the table is an average of the outcomes of 24 separate DMC simulations with different randomly chosen twists. Results obtained by applying Chiesa kinetic (ΔKE) and potential (ΔPE) finite-size corrections to DMC energies calculated using the Ewald interaction agree well with results obtained by applying only the Chiesa kinetic correction to DMC energies calculated using the modified periodic Coulomb interaction. The use of twist averaging has much reduced the independent-particle finite-size errors observed in Table I. Energies are in eV per atom.

N	Ewald	Ewald + ΔKE	Ewald + ΔPE	Ewald + $\Delta KE + \Delta PE$	MPC	$MPC + \Delta KE$
32	-7.0008(4)	-6.9802(4)	-6.9334(4)	-6.9128(4)	-6.9301(6)	-6.9095(6)
48	-6.9708(4)	-6.9699(4)	-6.9100(4)	-6.9092(4)	-6.9089(5)	-6.9080(5)
72	-6.9590(3)	-6.9563(3)	-6.9207(3)	-6.9180(3)	-6.9203(2)	-6.9177(2)
96	-6.9489(2)	-6.9467(2)	-6.9184(2)	-6.9162(2)	-6.9207(2)	-6.9176(2)
144	-6.9291(2)	-6.9251(2)	-6.9113(2)	-6.9073(2)	-6.9118(2)	-6.9078(2)

TABLE III. DMC energies of aluminum for different numbers N of atoms in the simulation cell. Every energy appearing in the table is an average of the outcomes of 24 separate DMC simulations with different randomly chosen twists. Results obtained by applying Chiesa kinetic (ΔKE) and potential (ΔPE) finite-size corrections to DMC energies calculated using the Ewald interaction agree well with results obtained by applying only the Chiesa kinetic correction to DMC energies calculated using the modified periodic Coulomb interaction. Energies are in eV per atom.

N	Ewald	Ewald + ΔKE	Ewald + ΔPE	Ewald + ΔKE + ΔPE	MPC	$MPC + \Delta KE$
24	-56.175(2)	-56.170(2)	-55.932(2)	-55.927(2)	-56.095(2)	-56.091(2)
32	-56.203(1)	-56.152(1)	-56.074(1)	-56.022(1)	-56.0585(2)	-56.003(2)
48	-56.155(1)	-56.138(1)	-56.048(1)	-56.031(1)	-56.058(2)	-56.041(2)
72	-56.0922(7)	-56.0808(7)	-56.0212(7)	-56.0098(7)	-56.0226(8)	-56.0112(8)

Brillouin zone that produces the twist-averaged energy would completely remove the single-particle FS errors if carried out exactly, but in practice, the integration has to be approximated as a summation over a finite set of twists. The summation tends to the integral as either the number N of atoms in the simulation cell or the number N_{twist} of twists used tends to infinity but is far from perfect in practice. Checking the convergence with respect to both N and N_{twist} is important, since fully twist-averaged calculations for finite simulation cells still contain many-body FS errors and do not necessarily provide accurate results. The main reason is that the fully twistaveraged exchange-correlation energy still depends on N, even though the one-electron part of the fully twist-averaged kinetic energy does not. Comparing the finite-size-corrected and twist-averaged DMC energies from Table II with the Γ -point energies from Table I shows that twist averaging much reduces the finite-size errors and allows accurate results to be obtained using much smaller simulation cells. In this particular case (but not in general), it also produces a lower ground state energy.

Our twist-averaged DMC results were obtained using 24 randomly sampled twists (values of \mathbf{k}_s) in the simulationcell Brillouin zone. Two other practical sampling schemes exist. One is to use a uniform Monkhorst-Pack grid³¹ of \mathbf{k}_s points centered on the Γ -point of the simulation-cell Brillouin zone, and the other is to use a uniform grid centered on the Baldereschi point³² of the simulation-cell Brillouin zone. As either the number of twists or the size of the simulation cell tends to infinity, all three twist-averaging methods yield the same results.

In applications of DMC to real systems using computers routinely available to researchers, it is rarely possible to treat very large simulation cells or numbers of twists. Restricting the number of twists is particularly problematic in metallic systems, where the Fermi surface discontinuity makes the integrand (for example, the total kinetic energy) a discontinuous function of \mathbf{k}_s at zero temperature. The convergence with system size and number of twists is therefore much slower for metals than for insulators. Hartree-Fock calculations for the uniform electron gas¹⁰ show that energies obtained using Baldereschi twist averaging converge faster than energies obtained using random twist averaging at very large numbers of twists (although it could be argued that the choice of the Baldereschi point introduces a systematic bias into the unconverged results), but that both methods converge slowly. Here, we show that the use of the incomplete-twistaveraging correction defined in Eq. (7) allows well-converged results to be obtained with very small numbers of twists. The choice between Baldereschi and random twist sampling is then unimportant.

Tables IV and V compare twist-averaged DMC results obtained using the Δ BZ incomplete-twist-averaging FS correction and several different many-body FS-correction methods. The convergence of the FS-corrected DMC energies with system size N is excellent and there is no difficulty in reaching an accuracy of a few meV per atom. As before, our DMC energies are averages over 24 randomly chosen twists in the simulation-cell Brillouin zone, corresponding to 24 randomly translated $L \times L \times L$ Monkhorst-Pack k-point meshes in the primitive Brillouin zone. We also carried out twist-averaged DMC calculations using 36 twists; the change in the total energy was less than 1.5 meV/atom for Li and less than 2.7 meV/atom for Al. This shows that twistaveraged DMC energies including Δ BZ corrections converge very rapidly as the number of twists is increased.

Figure 1 shows how the FS-corrected DMC energies of metallic Li depend on system size, allowing an easy comparison of the three different many-body FS-correction methods considered in this work. All DMC energies are averaged over 24 randomly chosen twists and include ΔBZ corrections. Red squares indicate DMC results calculated using the Ewald interaction with Chiesa corrections for the kinetic and potential energies (Ewald + ΔKE + ΔPE + ΔBZ); green circles indicate DMC results obtained using the modified

TABLE IV. DMC energies of lithium for different numbers *N* of atoms in the simulation cell. Every DMC energy is an average of the outcomes of 24 separate DMC simulations with different randomly chosen twists. The incomplete-twist-averaging finite-size correction ΔBZ is included in all energies. Results obtained by applying the Chiesa kinetic (ΔKE) and potential (ΔPE) finite-size corrections to DMC energies calculated using the Ewald interaction agree well with results obtained by applying the Chiesa kinetic correction to DMC energies calculated using the modified periodic Coulomb interaction. Results obtained using the twist-averaged KZK method, which also include an equivalent of the ΔBZ correction, are also in good agreement. Energies are in eV per atom.

N	Ewald + ΔKE + ΔPE + ΔBZ	$MPC + \Delta KE + \Delta BZ$	TAV-KZK
32	-6.9299(4)	-6.9267(4)	-6.9126(4)
48	-6.9183(4)	-6.9172(4)	-6.9095(4)
72	-6.9186(3)	-6.9182(3)	-6.9126(3)
96	-6.9149(2)	-6.9163(2)	-6.9123(2)
144	-6.9142(2)	-6.9147(2)	-6.9125(2)

TABLE V. DMC energies of aluminum for different numbers N of atoms in the simulation cell. Every DMC energy is an average of the outcomes of 24 separate DMC simulations with different randomly chosen twists. The incomplete-twist-averaging finite-size correction ΔBZ is included in all results. Results obtained by applying the Chiesa kinetic (ΔKE) and potential (ΔPE) finite-size corrections to DMC energies calculated using the Ewald interaction agree well with results obtained by applying the Chiesa kinetic correction to DMC energies calculated using the modified periodic Coulomb interaction. Results obtained using the twist-averaged KZK method, which also include an equivalent of the ΔBZ correction, are also in good agreement. Energies are in eV per atom.

Ν	Ewald + ΔKE + ΔPE + ΔBZ	$MPC + \Delta KE + \Delta BZ$	TAV-KZK
24	-56.019(2)	-56.183(2)	-56.025(2)
32	-56.088(1)	-56.069(2)	-56.088(1)
48	-56.078(1)	-56.088(2)	-56.081(1)
72	-56.0607(7)	-56.0621(8)	-56.0626(7)

periodic Coulomb interaction with Chiesa corrections for the kinetic energy only (MPC + Δ KE + Δ BZ); and blue circles indicate KZK-corrected DMC results, again incorporating Δ BZ corrections. Even for the smallest simulation cell considered, with just 32 atoms, the errors in the Ewald + Δ KE + Δ PE + Δ BZ and MPC + Δ KE + Δ BZ total energies are only 15.7 and 12 meV/atom, respectively. The errors in Ewald DMC energies corrected using the KZK scheme are even smaller, at approximately 3 meV/atom.

We emphasize the importance of the success of the twistaveraged KZK method from a practical point of view. It is known, for example, that the cheap and widely used DFT approach often fails to provide accurate enough results³³ to understand the behavior of materials at high pressure. Therefore, to study the very interesting phase diagram of Li,³⁴ it will be necessary to perform full many-body computations, most likely using DMC. The drawback is that DMC calculations are typically at least a 1000 times more expensive than DFT calculations. The twist-averaged KZK approach allows one to investigate a large number of possible crystal structures and



FIG. 1. Total DMC energies of Li as function of the number of particles in the simulation cell. All energies are averaged over 24 randomly chosen twists and include Δ BZ corrections. Red squares indicate DMC results calculated using the Ewald interaction with Chiesa corrections for the kinetic and potential energies (Ewald+ Δ KE+ Δ PE+ Δ BZ); green circles indicate DMC results obtained using the modified periodic Coulomb interaction with Chiesa corrections for the kinetic energy only (MPC+ Δ KE+ Δ BZ); and blue circles indicate KZK-corrected DMC results, again incorporating Δ BZ corrections.



FIG. 2. Total DMC energies of Al as function of the number of particles in simulation cell. All energies are averaged over 24 randomly chosen twists and include Δ BZ corrections. Red squares indicate DMC results calculated using the Ewald interaction with Chiesa corrections for the kinetic and potential energies (Ewald+ Δ KE+ Δ PE+ Δ BZ); green circles indicate DMC results obtained using the modified periodic Coulomb interaction with Chiesa corrections for the kinetic energy only (MPC+ Δ KE+ Δ BZ); and blue circles indicate KZK-corrected DMC results, again incorporating Δ BZ corrections.

construct the Li phase diagram whilst keeping the cost of the DMC simulations within reasonable bounds.

Figure 2 shows how the FS-corrected DMC energy of metallic Al depends on the number of atoms in the simulation cell. All DMC energies are averaged over 24 randomly chosen twists and include ΔBZ corrections. Red squares indicate FS-corrected results obtained using the Ewald interaction with Chiesa corrections for the kinetic and potential energies (Ewald + ΔKE + ΔPE + ΔBZ); green circles indicate DMC results obtained using the MPC interaction with Chiesa corrections for the kinetic energy only (MPC + Δ KE + Δ BZ); and blue circles indicate KZK-corrected DMC results, again incorporating ΔBZ corrections. For all simulation-cell sizes, the Ewald + ΔKE + ΔPE + ΔBZ and KZK results are in almost perfect agreement. The difference between the MPC $+\Delta KE + \Delta BZ$ energies and those obtained using the other two FS-correction methods is about 7 meV/atom for a cell containing just 48 atoms and decreases rapidly with increasing simulation-cell size.

The results of this section have shown that the addition of an incomplete twist-averaging correction, ΔBZ , allows accurate results to be obtained with a remarkably small number of twists, even for metals. In most of the cases studied (except for the 96-atom Li simulation cell), the ΔBZ correction lowers the total DMC energy. The values of ΔBZ for Li simulation cells containing 32, 48, 72, 96, and 144 atoms are -0.0171, -0.0091, -0.0006, +0.0013, and -0.0069 eV, respectively. In the case of Al simulation cells containing 24, 32, 48, and 72 atoms, the values of ΔBZ are -0.092, -0.066, -0.047, and -0.050 eV, respectively. A recent paper by Shulenberger and Mattsson³⁷ provided accurate benchmark DMC results for a wide range of different bulk materials. They required 216 and 64 twists to obtain converged results for Li and Al supercells containing 28 and 108 atoms, respectively. Because we use incomplete twist-averaging corrections, ΔBZ , we are able to obtain similarly accurate results with considerably fewer twists.

IV. CONCLUSION

We have systematically analyzed and compared the various schemes that have been proposed for correcting FS errors in QMC simulations of real metallic systems. We have explained how to combine the use of twist-averaged boundary conditions with the KZK functional and shown the value of incomplete-twist-averaging corrections based on DFT. The reassuring news is that all of the commonly used approaches work well.

We believe that the use of DFT-based incomplete-twistaveraging corrections will have an important role to play in DMC simulations of real metallic systems. The reliance on DFT could be considered a drawback, but it is important to bear in mind that *any* valid FS-correction method must yield the same total energy in the limit of a large enough simulation cell. The important question is not whether the unattainable limiting value is correct but how rapidly it is approached. The use of incomplete-twist-averaging corrections significantly improves this convergence. Furthermore, energies calculated using the twist-averaged KZK scheme (which implicitly incorporates a ΔBZ incomplete-twist-averaging correction) often settle down to a system-size-independent constant more quickly than energies calculated using other methods incorporating ΔBZ corrections.

We believe that this paper will provide a useful guide and benchmark for researchers using QMC and other many-body electronic structure methods such as CCSD(T) and the Green's function methods such as GW approximation to study metallic systems.

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