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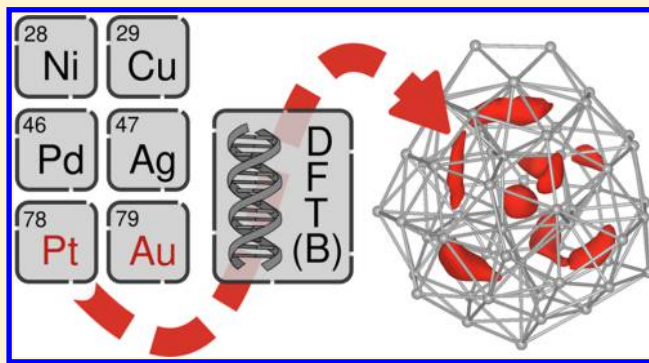
DFTB-Assisted Global Structure Optimization of 13- and 55-Atom Late Transition Metal Clusters

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 Supporting Information

ABSTRACT: Finding globally optimal structures of nanoclusters is critically important to understand their physicochemical properties but remains prohibitively expensive even with comparatively efficient density functionals. Semi-empirical methods such as density functional tight-binding (DFTB), on the other hand, offer a better accuracy-efficiency trade-off but require suitable parametrization. In the present work, we present a largely automatic scheme where, starting from initial guesses based on bulk properties, the atomic confinement, and repulsive potentials are further refined so as to accurately represent the potential energy landscapes of 13- and 55-atom nanoclusters of the late transition metals (Ni, Cu, Pd, Ag, Pt, and Au). With the exception of Ni₁₃, Ni₅₅, Cu₅₅, and Ag₅₅, low-symmetry (often disordered) structures are found to be preferred over the symmetric icosahedral arrangement. Similar to what has been previously reported for Au₅₅, the lowest-energy Pt₅₅ structures also appear to contain small cavities below the outer shell.



1. INTRODUCTION

Metal clusters have found numerous applications in a variety of technologies, including heterogeneous catalysis as well as medicinal and optoelectronic devices.¹ Their usefulness stems from a high specific surface area, together with chemical and physical properties that are different from those of extended metal surfaces and that often vary with the size and shape of the cluster.² Nanometer-sized Au particles on oxide supports, for example, can turn the otherwise inert Au into a potent oxidation catalyst.³

Insights into the most probable structural arrangements of such clusters are then of prime importance for a detailed understanding of their properties and for the rational design of further improved materials.⁴ While experimental methods can probe many characteristics of both free and supported metal clusters, complete structure determination is very difficult to achieve.

Atomistic simulations, on the other hand, offer the desired resolution but require a thorough search of the potential energy landscape to locate the most relevant (e.g., lowest energy) structures.⁵ Though such searches would preferentially be carried out using accurate and transferable electronic structure methods such as density functional theory (DFT), the computational cost and time-to-solution rapidly become intractable as the number of metal atoms is increased. While global optimization (GO) of clusters with a few tens of atoms can nowadays be performed directly at the DFT level^{6,7} given ample resources, larger cluster sizes are likely to remain out of reach for a considerable time to come. The inclusion of a

support material further reduces the currently accessible cluster size to about 10 metal atoms.^{8–10}

Along with continued development of more efficient GO algorithms,^{11–13} there is therefore a pressing need for alternative descriptions of the potential energy landscape which trade an acceptable decrease in accuracy for a considerable increase in speed. Interatomic potentials such as embedded atom methods (EAM) and Gupta potentials, for example, present a very low computational cost. The same is generally true of machine learning approaches, such as neural networks,^{14,15} though the large amount of required training data evidently impacts the total cost.

Approximate electronic structure methods, such as density functional tight-binding (DFTB), constitute a third option with an appealing set of advantages. The cost per force call is 2–3 orders of magnitude below that of efficient GGA-DFT implementations,¹⁶ while retaining an explicit (though strongly simplified) description of the electronic structure. Furthermore, generating suitable DFTB parametrizations is comparatively straightforward and lends itself well to automatization.^{17,18} Lastly, DFTB can be made to reproduce DFT properties more accurately than common interatomic potentials, which will also be illustrated here.

Even though one may have expected metallic compounds to present significant challenges to the two-center and minimal-

basis approximations in standard DFTB, encouraging results have been previously reported for many transition metals, such as Fe,^{19–22} Au,^{23–26} Ag,^{26,27} Mo,²⁸ and Pt–Ru alloys²⁹ and other small transition metal clusters.³⁰

Compared to these previous studies, the present work describes a DFTB parametrization scheme that is more specifically tailored toward and integrated into the GO problem at hand. After a brief outline of DFTB in section 2, this approach is described in detail in section 3. The results are then presented and discussed for the 13- and 55-atom clusters of the late transition metals (Ni, Cu, Pd, Ag, Pt, Au) in section 5, followed by concluding remarks in section 6. The two cluster sizes have been chosen so as to evaluate the prevalence of the icosahedral motif relative to more disordered arrangements.

2. DFTB BACKGROUND

DFTB constitutes an approximation to LCAO–DFT in which the computational cost is reduced through (i) the use of a small (preferentially minimal) set of optimized basis functions ϕ , (ii) the approximate evaluation of Hamiltonian matrix elements, and (iii) the introduction of an empirical “repulsive” potential to represent the remaining contributions to the DFT total energy. In self-consistent charge (SCC) DFTB, the expression for the total energy is then given by³¹

$$E_{\text{tot}} = E_{\text{band}} + E_{\text{sc}} + E_{\text{rep}} \quad (1)$$

The band structure energy E_{band} is calculated by summing the eigenvalues ϵ_i of the occupied states gathered from a self-consistent solution to the secular equations

$$[\mathcal{H}^0 + \Delta\mathcal{H} - \epsilon\mathcal{S}]C = 0 \quad (2)$$

where \mathcal{H}^0 is the Hamiltonian matrix consistent with a superposition of atomic densities ρ^0 , $\Delta\mathcal{H}$ its electrostatic corrections due to charge density fluctuations, and with the overlap and coefficient matrices \mathcal{S} and C .

The $\mathcal{H}_{\mu\nu}^0 = \langle \phi_\mu | -\frac{1}{2}\nabla^2 + V_{\text{eff}}[\rho^0] | \phi_\nu \rangle$ matrix elements are approximated by only considering the contributions to the effective potential V_{eff} of the atomic centers a and b on which the orbitals μ and ν are located. In the density superposition scheme $V_{\text{eff}}[\rho^0]$ then reduces to $V_{\text{eff}}[\rho_a^0 + \delta_{ab}\rho_b^0]$. As a result, the one-center integrals correspond to $\mathcal{H}_{\mu\nu}^0 = \delta_{\mu\nu}\epsilon_\mu$ (with ϵ_μ the corresponding eigenvalue in the isolated atom) and $\mathcal{S}_{\mu\nu} = \delta_{\mu\nu}$. The two-center \mathcal{H}^0 and \mathcal{S} integrals are computed beforehand and tabulated as a function of distance and orientation, making use of the Slater-Koster transformation rules.³² The required basis functions ϕ and atomic densities ρ^0 are obtained from atomic DFT calculations with added confinement through the use of, e.g., polynomial potentials

$$V_{\text{conf}} = \left(\frac{r}{r_0} \right)^s \quad (3)$$

with empirical parameters r_0 and s , which can be chosen differently for each of the different orbital angular momenta and the density ρ^0 .

The SCC corrections $\Delta\mathcal{H}$ and E_{sc} to the Hamiltonian and the total energy (described in detail in refs 31 and 33) can then be constructed after approximating the charge density fluctuations as atom-centered, exponentially decaying charge distributions. The l -dependent atomic charges are convention-

ally deduced from a Mulliken population analysis of the occupied electronic states. The decay lengths are determined from the Hubbard parameters U_l , which can in turn be calculated as the difference between the electron removal and electron addition energies from atomic DFT calculations.

The final E_{rep} term is intended to contain all remaining contributions to the total energy (such as core–core repulsion) and, to a certain degree, correct the approximations made in the E_{band} and E_{sc} terms. A major convenience of this decomposition is that a set of smooth, short-ranged potentials for each element pair generally succeeds well in representing E_{rep} ^{31,34} i.e.,

$$E_{\text{rep}} = \sum_{i<j} V_{\text{rep},ij}(r_{ij}) \quad (4)$$

Fitting V_{rep} becomes a straightforward linear regression problem when using polynomial functions, e.g.

$$V_{\text{rep}}(r) = \sum_{p=2}^6 c_p (r_{\text{cut}} - r)^p \quad (5)$$

The cutoff radius r_{cut} is typically chosen in between the first- and second-nearest neighbor distances of the element pair in question.

3. METHODS

In seeking to accelerate GO searches using DFTB, one faces the problem that the DFTB parametrization needs to be most accurate for the low-lying minima of the DFT potential energy surface (PES). Including information on low-energy structures in the DFTB training set, however, seems to itself require the solution of the GO problem at hand. The previously published tight-binding approximation enhanced global optimization (TANGO) approach³⁵ addresses this bootstrapping problem by creating an initial, preliminary parametrization (using, e.g., a randomly generated structure database), which is then iteratively refined based on DFT single-point calculations of low-energy structures suggested by the same parametrization.

The same approach will be used here, though with certain simplifications (compared to the TANGO searches for bulk crystal structures in ref 35), made possible by previous studies on DFTB parametrizations for metal clusters. Most notably, Fihey and co-workers²⁵ have described a parametrization procedure for Au clusters which performs quite adequately given its relative simplicity. This process is depicted in the top panel of Figure 1 and will be adopted here to generate the initial DFTB parametrization in the TANGO runs.

First, the eigenvalues ϵ_l and Hubbard parameters U_l of the isolated, spherical, and spin-unpolarized atom are obtained from all-electron atomic DFT calculations, here performed using the ATOM code in the CP2K suite^{36–38} using the Douglas–Kroll–Hess method^{39–41} to include scalar-relativistic effects.

The parameters describing the confinement of the s , p , and d orbitals and the electron density ρ^0 are then optimized using the gradient-less COBYLA algorithm⁴² so that the DFTB band structures of the bulk FCC, BCC and SC crystals match the corresponding DFT band structures. Following ref 25, most importance is attached to the band structure around the Fermi level, which is done here by assigning Boltzmann-distributed weights

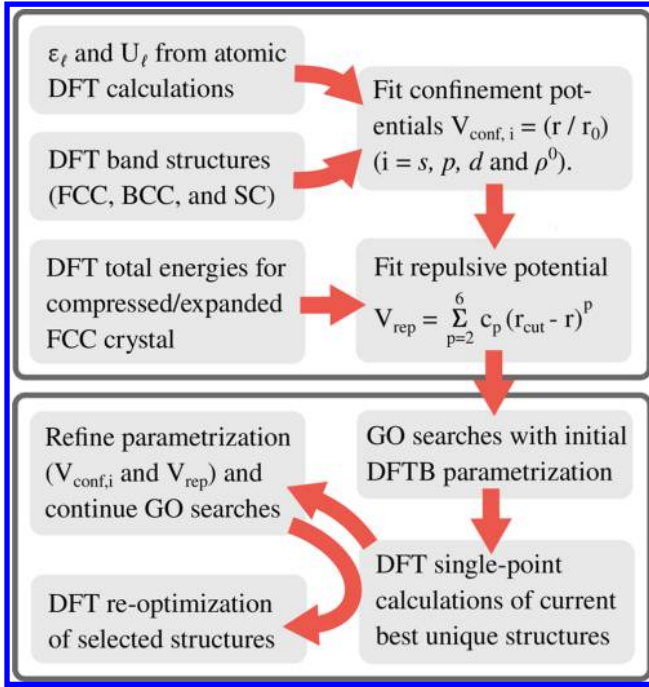


Figure 1. Overview of the DFTB parametrization plus global optimization strategy for the studied transition metal clusters.

$$w = \exp\left(-\frac{|e - E_{\text{Fermi}}|}{k_{\text{B}}T}\right) \quad (6)$$

with $k_{\text{B}}T$ set equal to 1.5 eV. The band structure fitting and associated atomic DFT calculations under confinement and Slater–Koster tabulation are performed using the Hotcent code⁷⁹ (commit ab939fe2) developed as part of this work.

To complete the initial DFTB parametrization, the repulsive potential is calculated based on the difference between the DFT total energy and the repulsionless DFTB total energy of the FCC structure for interatomic distances ranging from 1.4 to 3 times the covalent radius of the metal.

The next phase, represented by the bottom panel in Figure 1, starts with a set of comparatively short GO searches to identify the type of geometries favored by the present DFTB parametrization. The 100 best unique structures are then subjected to DFT single-point calculations, thereby creating a training set for further refinement of the DFTB model. Both the confinement and repulsive potentials are optimized to lower the total residual. For reasons of numerical stability, however, the confinement potentials are here restricted to the harmonic kind ($s = 2$), while allowing r_0 to vary. The total residual is given by

$$R_{\text{SSQ}} = \sum_{i=1}^M \omega_i \left[(E_{\text{coh},i}^{\text{DFT}} - E_{\text{coh},i}^{\text{DFTB}} - C)^2 + \omega_f \sum_{j=1}^N \left\| \bar{F}_{ij}^{\text{DFT}} - \bar{F}_{ij}^{\text{DFTB}} \right\|^2 \right] \quad (7)$$

with $E_{\text{coh},i}$ the cohesive energy of structure i and \bar{F}_{ij} the force on atom j of structure i . The weights ω_i are distributed according to the relative DFT total energies, following a Boltzmann distribution as in eq 6 with $k_{\text{B}}T$ set to 0.1 eV times the number of atoms. An additional scaling factor ω_f of 0.1 Å/

atom is applied to the force residuals, which is found to provide a suitable balance between the description of energetical and geometrical properties. Note that the procedure allows for a constant shift C of the DFTB cohesive energies, so as to prevent accuracy losses due to consistent under- or overbinding tendencies which do not affect the energetical ordering for a given cluster size. The smoothness of the V_{rep} curve is assured by weak \mathcal{L}_2 regularization of the linear regression problem with a regularization factor of 10^{-10} . The repulsive potential fitting is performed using the TANGO code⁸⁰ (commit b1c5bcb) with a polynomial form of $V_{\text{rep}}(r)$ as shown in eq 5.

Lastly, the GO searches are resumed with the refined DFTB parametrization and pursued more extensively so as to retrieve the lowest-lying minima on the DFTB PES. Again, the 100 best unique structures are selected and subjected to DFT single-point calculations. On the basis of the obtained DFT total energies, the 25 lowest-energy structures are reoptimized at the DFT level until the residual forces are less than 0.05 eV/Å.

4. COMPUTATIONAL DETAILS

4.1. DFT Calculations. All metal cluster DFT calculations are executed using the GPAW^{43,44} code using a plane-wave basis set with a kinetic energy cutoff of 600 eV. The Brillouin-zone integration is restricted to the Γ point and the SCF converge is facilitated by Fermi–Dirac smearing with a width of 20 meV. The PBEsol functional⁴⁵ is chosen for the description of electronic exchange and correlation, as this functional has been found to be more accurate than other gradient-corrected functionals for small Au clusters,⁴⁶ in addition to generally providing accurate lattice parameters as well as jellium surface energies.^{45,47,48} Note that all atomic DFT calculations as well as the density superposition calculations of the Hamiltonian integrals are also performed using the PBEsol functional and with addition of scalar-relativistic corrections. The number of explicitly treated valence electrons is limited to 10 (Ni, Pd, Pt) and 11 (Cu, Ag, Au) per atom using the standard projector augmented-wave⁴⁹ setups in GPAW regenerated for the PBEsol functional. It should be noted that spin polarization has not been included in the DFT(B) calculations unless stated otherwise.

4.2. DFTB Calculations. All DFTB calculations are carried out using the DFTB+ code⁵⁰ (version 17.1) with a maximum angular momentum $l_{\text{max}} = 2$ and angular momentum dependent Hubbard values. The applied Fermi–Dirac smearing width amounts to 500 K (42 meV).

Though timings usually vary across different hardware and software environments, the relative speed of DFTB can be appreciated by looking at the CPU time per force call. For the 55-atom clusters, we obtain approximately one second per DFTB force call on a single CPU, compared to ca. 300 s per force call using 32 CPUs with the above DFT setup.

4.3. Global Optimization. The GO searches are performed using the genetic algorithm (GA) framework^{10,51} in the atomic simulation environment (ASE).^{52,53} Each GA run involves the following steps:

1. Randomly generating 20 clusters with coordinates within a sphere of 110 Å³ (13 atoms) and 460 Å³ (55 atoms), corresponding to a number density of about 0.12 atoms per Å³. The clusters are placed in cubic unit cells with

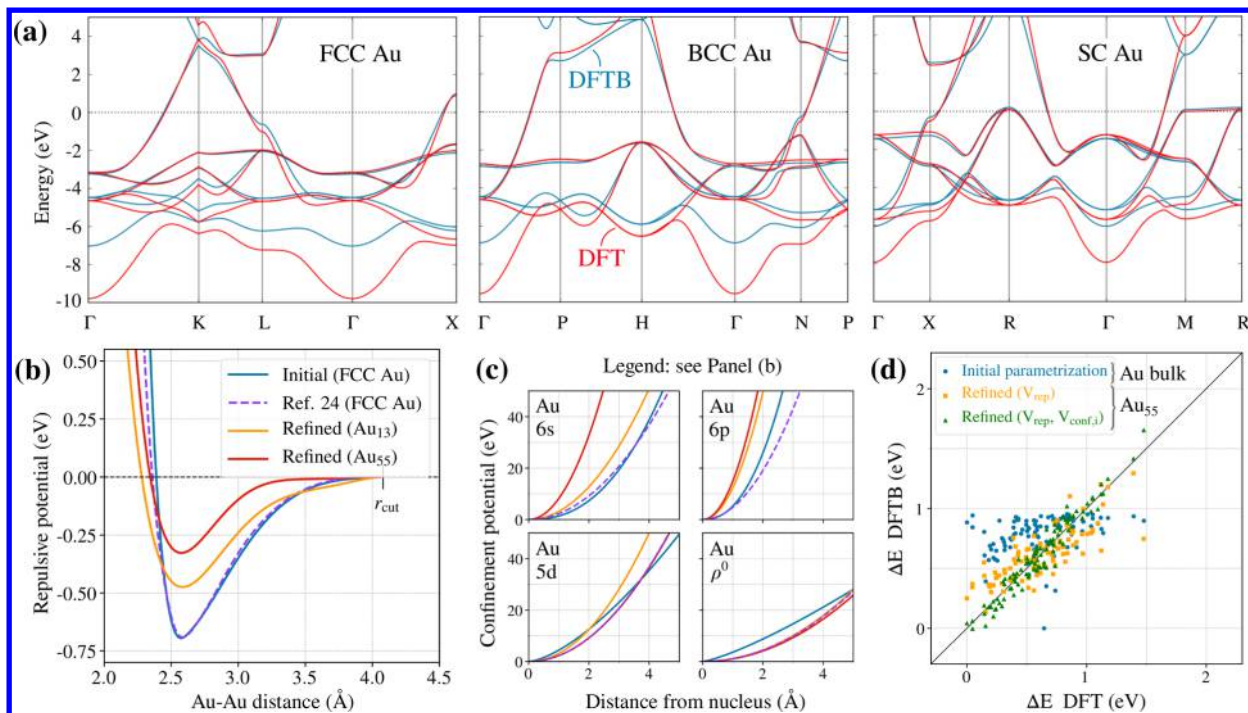


Figure 2. Panel a: Calculated band structures for FCC, BCC and SC Au using DFT (red) and DFTB with optimized confinement potentials (blue). The eigenvalues are referenced with respect to the Fermi energy. Panel b: Repulsive potential between Au atoms in the initial parametrization based on bulk Au properties (blue) and in the refined parametrizations for Au₁₃ (orange) and Au₅₅ (red) where the repulsive and confinement potentials have been reoptimized. The curve obtained by Fihey and co-workers²⁵ is drawn with purple dashes. Panel c: Analogous representation of the confinement potentials for the different valence states of Au and its reference atomic density. Panel d: Parity diagrams comparing the relative DFTB and DFT energies for the 100 best unique Au₅₅ cluster structures obtained from the first series of GO searches using the initial parametrization based on bulk Au properties (blue dots). The DFTB results obtained after refitting V_{rep} only (orange) and both V_{rep} and $V_{\text{conf},i}$ (green) are also shown.

cell lengths of 16 and 25 Å for 13- and 55-atom clusters, respectively.

2. Subjecting the initial structures to local minimization with DFTB using the BFGS algorithm⁵⁴ until the largest forces are less than 0.03 eV/Å. The set of relaxed structures constitutes the initial population.
3. At each GA iteration, a new candidate is created by the action of the genetic operators on one or two members of the population (randomly selected via the same procedure as in ref 51), followed by the same local minimization procedure as above. The genetic operator is chosen among cut-and-splice pairing, rattle mutation and mirror mutation with 85%, 10%, and 5% probability, respectively. The population is then updated so as to always contain the 20 current best unique structures. Structural uniqueness is evaluated using fingerprint functions.¹²

For the 13-atom clusters, the number of GA iterations is set to 100 for the search with the initial DFTB parametrization and to 200 using the refined parameters. The corresponding numbers for the 55-atom clusters amount to 500 and 1000, respectively. To increase the probability of finding the lowest-energy minima, 16 GA searches are run in parallel on each occasion. In the case of Pt₅₅, the initial parametrization is found to be particularly crude (favoring very open structures with only four atoms in the inner shell), and therefore an additional 1000 GA iterations is performed after a second reparametrization based on the 100 best unique Pt₅₅ structures found using the first reparametrized DFTB model.

5. RESULTS AND DISCUSSION

First, the results specific to the DFTB parametrization procedures will be presented and discussed. Next, the obtained lowest-energy structures will be shown for the 13-atom clusters with comparison to previous studies, followed by the corresponding discussion for the 55-atom clusters.

5.1. DFTB Parametrization. Various aspects of the (re)parametrization procedure are collected in Figure 2 for the case of Au (corresponding results for the other elements are included in the Supporting Information).

Panel a shows the DFTB band structures (blue lines) which have been fitted to DFT (red lines) by adjustment of the confinement parameters r_0 and s . The reproduction is of a similar quality as in ref 25. The obtained confinement potentials are also comparable (see the filled blue and dashed purple curves in panel c), keeping in mind that the parametrization in ref 25 has been performed on the basis of a different density functional (PBE). It should be noted, however, that the confinement parameters from ref 25 have been used here as initial guesses, and that the optimization procedure has most likely converged to the closest local minimum. The repulsive potential for Au derived from bulk FCC structures is shown as the blue curve in panel b. Again, similar to what has been obtained in ref 25 (purple dashes), the repulsive potential is in fact attractive at commonly encountered nearest neighbor distances (r between than 2 and 4 Å). Similar results are retrieved for the other elements. While attractive pair potentials are relatively uncommon and may benefit from further investigation, it should be noted that these

need not imply a failure of, e.g., the two-center approximation (see, e.g., ref 33).

As described in section 3, the DFTB parametrizations based on the bulk metal properties are only used as initial guesses, requiring further refinement based on DFT single-point calculations of the best unique structures obtained from a first round of GO searches. The change in the repulsive and confinement potentials can be seen in panels b and c, respectively, with results for Au_{13} in yellow and Au_{55} in red. The benefits of the reparametrization are clearly illustrated by the parity plots for Au_{55} shown in panel d. The correlation between the energetical ordering in DFT and DFTB is fairly poor in the initial DFTB parametrization (blue dots), and is markedly improved after fitting the repulsive and confinement potentials to the DFT data set (green dots). Readjusting only the repulsive potential (orange dots) yields intermediate results, and it is therefore recommended to also refine the confinement parameters. Similar conclusions can be drawn from the parity diagrams of the other studied clusters, which can be consulted in section 4 of the Supporting Information.

While the combined reoptimization complicates the comparison between the 13- and 55-atom parametrizations due to possible compensation effects, the different V_{rep} and $V_{\text{conf},i}$ functions for the two cluster sizes suggest that it may be difficult to find a single parameter set which yields sufficiently accurate descriptions for both sizes. Readers interested in the topic of size-transferability are referred to section 5 of the Supporting Information for additional metrics and discussion. We furthermore note that choosing a single r_0 value equal to ca. 1.85 times the covalent radius (as is common in DFTB models for main group chemistry^{55,56}) is not recommended for the present materials.

5.2. M_{13} Clusters. Structural models of the most stable M_{13} clusters after DFT reoptimization are shown in Figure 3. Only for Ni the icosahedron represents the preferred arrangement, in agreement with previous calculations performed with a Gupta potential.⁵⁸ Among the coinage metals, Cu and Ag prefer similar low-symmetry structures, which also bear a certain resemblance to the one found for Au. This is in agreement with previous calculations performed using the PW91 functional.⁵⁹ In the case of Pd, the same bilayer geometry with C_{3v} symmetry is retrieved as previously found using the PBE functional for a singlet multiplicity.⁶⁰ The C_5 -symmetrical Pt_{13} structure is identical to the ones proposed on the basis of PW91⁶¹ and PBE calculations.⁶¹ It should be kept in mind, however, that the precise energetical ordering of metal clusters can be sensitive to the choice of exchange-correlation functional, as has been illustrated for Au.^{46,62–65}

5.3. M_{55} Clusters. The corresponding M_{55} cluster geometries are shown in Figure 3 for Pd, Pt, and Au, while the Mackay icosahedron is retrieved as the lowest-energy configuration for Ni, Cu, and Ag. The latter is in agreement with experimental observations^{66–68} as well as a host of GO studies based on interatomic potentials.^{58,69,70}

A different picture emerges for Pd, Pt, and Au, which are found to prefer disordered structures. In the case of Au, this is indeed known from photoelectron spectroscopy measurements.^{66,71} GO searches with a Gupta potential by Garzón and Posada-Amarillas⁷² have yielded a compact but indeed disordered structure, and a similar structure has been obtained by subsequent annealing runs with GGA-DFT.⁷¹ In the present work, we also find the lowest-energy Au_{55} cluster to be disordered, but with an otherwise quite different geometry

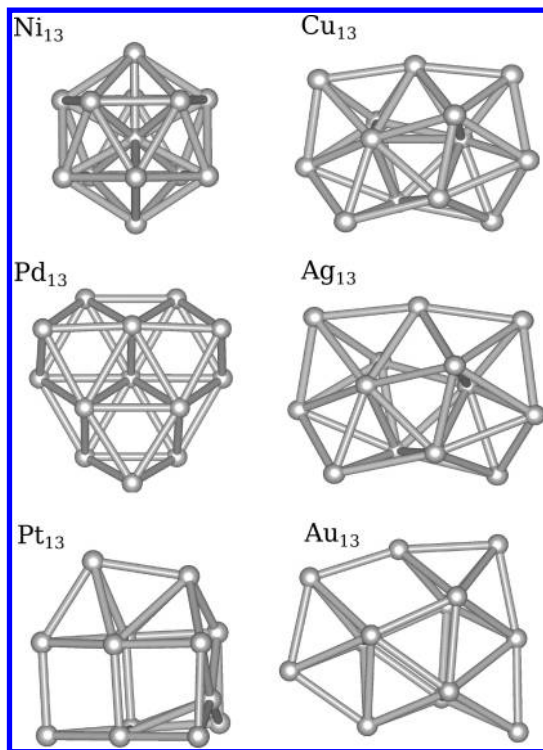


Figure 3. Lowest-energy structures obtained for the 13-atom clusters after DFT reoptimization. All structural models in this work have been rendered with VESTA.⁵⁷

(shown in Figure 4). Its most prominent feature is the presence of cavities below the outer shell, which are visualized as regions of low electron density (red surfaces). The structure is in this aspect similar to the ones proposed on the basis of DFTB-GO searches by Tarrat and co-workers²⁷ using the parametrization from ref 25, though the voids in the present structures appear to be smaller in volume. The presence of such subsurface cavities, or “bubbles”, has furthermore been previously suggested for Au clusters in the 56 to 58 atom range on the basis of DFT calculations,⁷¹ and it has been explained in terms of strong preferences for close-packed outer layers due to relativistic contraction of the 6s states.⁷¹ Lastly, with the PBEsol functional, we calculate the Au_{55} cluster shown in Figure 4 to be 0.53 eV more stable than the Garzón–Posada–Amarillas structure, 1.05 eV more stable than the Tarrat structure, and 1.46 eV more stable than the icosahedral arrangement. For comparison, the corresponding values using the PBE functional amount to 0.75, 0.16, and 2.03 eV, respectively. The present Au_{55} structure is hence also preferred

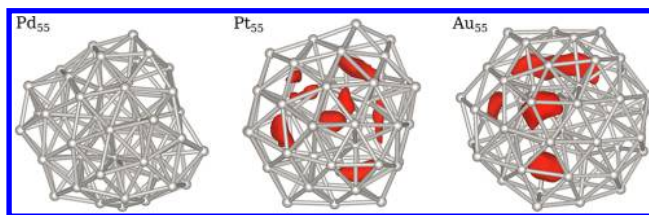


Figure 4. Lowest-energy structures obtained among the Pd_{55} , Pt_{55} , and Au_{55} clusters after DFT reoptimization. Cavities are highlighted by means of electron density isosurfaces (colored in red). For the other 55-atom clusters (i.e., Ni, Cu, and Ag) an icosahedral ground state is retrieved.

among the selected candidates in the PBE approximation. It is, however, quite likely that lower-energy configurations exist on the PBE energy landscape.

Platinum, the other element from the same period, is also found to prefer small (atom-sized) subsurface cavities below the outer shell (see Figure 4). This similarity is understandable as relativistic effects are almost as pronounced in Pt as in Au.⁷³ One difference, however, is the additional presence of a small cavity in the center, with the nine atoms in the core describing a gyroelongated square pyramid. Previous calculations with interatomic potentials, by contrast, have either favored the icosahedral structure⁷⁴ or lower-symmetry, but nonetheless compact structures.^{75–77} With the present DFT setup, the putative global minimum configuration is more stable than the icosahedron by a considerable margin ($\Delta E = -5.46$ eV).

Finally, for Pd₅₅ a compact, yet also disordered configuration is retrieved. In the past, the icosahedral structure has been proposed by studies based on EAM^{75,78} and Gupta potentials,⁷⁶ but the present configuration is found to be more stable according to DFT ($\Delta E = -0.70$ eV).

Across the different elements, the structures of the next lowest-energy isomers generally resemble those of the putative ground states, i.e., perturbed icosahedra in case of an icosahedral ground state and similarly disordered variations otherwise (see Figure 5). The energy gap between the lowest- and next-

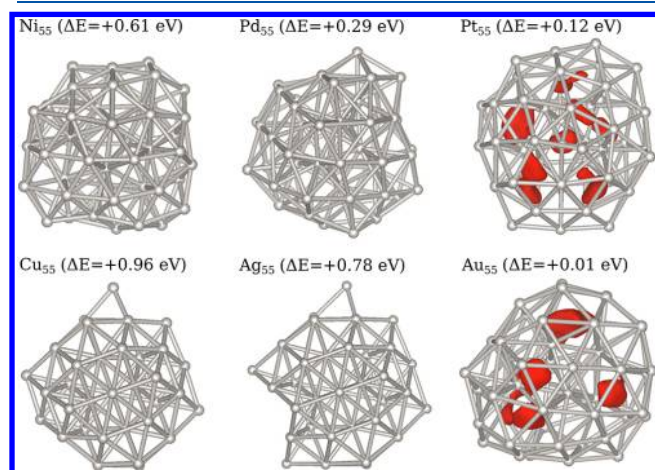


Figure 5. Next-lowest-energy structures obtained among the 55-atom clusters after DFT reoptimization, together with the energy differences relative to the respective ground states. Cavities in the Pt₅₅ and Au₅₅ structures are highlighted by means of electron density isosurfaces (colored in red).

lowest-energy structures is significantly larger in the former case (0.6–1.0 eV) than in the latter (<0.3 eV). Ni₅₅ appears to present an exception in the sense that disordered structures are competitive with perturbed icosahedra in terms of the total energy. Given the ferromagnetic properties of nickel, it is appropriate to consider the influence of spin polarization on the energetical ordering. As shown in Table 1, magnetization further increases the relative stability of the Mackay icosahedron, while decreasing that of the disordered isomer.

6. CONCLUSIONS

A combined DFTB parametrization and global optimization strategy is presented for the study of metal cluster structures. Starting from DFTB parameters derived from bulk metal properties, the GO algorithm allows to generate cluster

Table 1. Relative Energies (in eV) of the Two Next-Lowest-Energy Isomers of Ni₅₅ with Respect to the Mackay Icosahedron, Calculated with and without Spin Polarization Effects

structure	nonmagnetic	ferromagnetic
disordered structure	0.61	1.77
perturbed icosahedron	0.89	1.23

structures whose DFT energetics provide the basis for a more accurate subsequent DFTB parametrization. As a result, nanometer-sized clusters can be investigated with relative ease.

Application to the 13- and 55-atom clusters of the late transition metals confirms the preference for the icosahedral structure for Ni₁₃, Ni₅₅, Cu₅₅, and Ag₅₅ clusters, whereas, e.g., the lowest-energy M₅₅ clusters of Pd, Pt, and Au are strongly disordered. While the Pd₅₅ structures remain compact, the previously reported²⁷ subsurface cavities in Au₅₅ are here also observed in Pt₅₅.

The present approach hence facilitates the use of more realistic cluster models in, e.g., heterogeneous catalysis research, where high-symmetry structures have for example been frequently used for nanometer-sized Pd and Pt clusters. Promising further applications and developments of the method include the effects of alloying and of deposition on support materials.

■ ASSOCIATED CONTENT

📄 Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acs.jpca.9b00927.

Confinement parameters, band structures, repulsive potentials, parity diagrams, and transferability (PDF) Slater–Koster files in DFTB+ format containing the final parameters for each cluster type (ZIP) Coordinates in XYZ format of the five lowest-energy structures after DFT reoptimization for each cluster type (ZIP)

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Notes

The author declares no competing financial interest.

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