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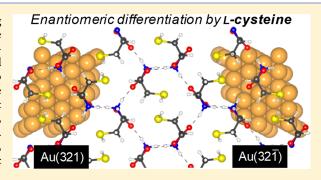
Chirality Transfer in Gold Nanoparticles by L-Cysteine Amino Acid: A First-Principles Study

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Supporting Information

ABSTRACT: The use of chiral organic ligands during nanoparticle synthesis is key to designing optically active materials for biological and catalytic applications. To understand such complex processes at the atomic level, we performed DFT simulations and built Wulff thermodynamic structures to model the impact of amino acids on gold nanoparticle morphology. Herein, we report the adsorption of L-cysteine at low and high coverage on achiral gold surfaces (111), (110), and (100) as well as chiral gold terminations (321) and (321). We found that L-cysteine preferentially binds to Au(321), inducing a chiral templating effect, and the enantiomeric enrichment is favored at low coverage situations.



INTRODUCTION

The precise control of morphologies and surface terminations of metal nanoparticles (NPs) is a major focus in synthetic nanotechnology, as their shape is intimately related to their activity and properties. $^{1-3}$ In the past decades, the shape control of gold nanoparticles (AuNPs) $^{4-6}$ has made great advances due to the relevance of these systems in sensing, 7 biomedicine, 8,9 and catalysis. 10,11

The role that NPs play in many biological¹² and optical¹³ applications creates the need to develop chiral materials. ^{14,15} The chiral templating of nanocrystals¹⁶ can be approached by using surface modifiers during nanoparticle growth. ¹⁷ Since the pioneering synthesis of optically active Au₂₈ clusters, ¹⁸ the preparation of chiral AuNPs has quickly developed. ¹⁹ Quite recently, Lee et al. reported the synthesis of twist-shaped chiral AuNPs using amino acids and peptides. ²⁰ Moreover, the impact of chirality of AuNP has been recently studied for optical²¹ and catalytic²² applications.

To predict nanocrystal shapes, ²³ we need a proper

To predict nanocrystal shapes, ²³ we need a proper description of the interaction between metal surfaces and organic ligands. ^{24,25} In that sense, computational modeling comes into play to provide atomistic detail at the nanoscale. ^{26–28} Adsorption studies on gold have been reported for a myriad of surface modifiers, such as thiol derivatives ²⁹ as well as amino acids and peptides, ^{30–33} among other ligands. ^{34–37} Because of the particular properties of the Au–S interface, ³⁸ the interaction between the sulfur-containing L-cysteine amino acid and Au surfaces is currently exploited to transfer chirality to AuNPs. ^{20–22} Most theoretical studies focus on low-Millerindex facets, ^{39–45} some of them including dynamics, ^{46,47} but only a few reports deal with chiral surfaces, ⁴⁸ such as Au(321) ⁴⁹ and Au(17 11 9). ^{50,51} With regard to the

morphology, the Wulff theorem⁵² provides a robust approach to predict the thermodynamic equilibrium shape of NPs. The method relies on the energy required to create each surface, γ_s . In the presence of solvent or ligand modifiers, the surface energies γ_s are replaced with those of the interface, γ_s .' This protocol⁵³ has been successfully employed to describe the equilibrium shape of thiolate-decorated AuNPs⁵⁴ as well as the effect of CO adsorption on different AuNP morphologies.⁵⁵

Nevertheless, the impact of enantiomeric differentiation by chiral modifiers on nanostructures has not been addressed. Here, we present density functional theory (DFT) simulations to study the chirality induced to AuNPs by organic ligands (Figure 1). We report the adsorption of the natural L-cysteine enantiomer on achiral gold surfaces (111), (110), and (100) as well as the enantiomeric gold facets (321) and (32 $\overline{1}$). We consider both low and high coverage situations and evaluate

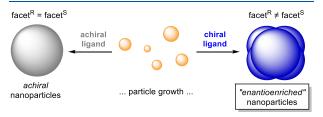


Figure 1. Differentiation of enantiomeric metal facets by chiral modifiers.

the impact of the chiral ligand on AuNP morphologies via Wulff constructions.

COMPUTATIONAL METHODS

All calculations were performed at the density functional theory (DFT) level using the Vienna Ab initio Simulation Package (VASP). The PBE exchange—correlation functional was used together with van der Waals corrections with the Grimme D3 approach. We employed the projected augmented wave (PAW) method to describe the core electrons and plane waves with a kinetic cutoff of 450 eV to describe valence electrons.

Periodic boundary conditions were employed to model Au surfaces for three low-Miller-index planes, (111), (110), and (100), and two high-Miller-index planes, (321) and (32 $\overline{1}$). The (111) and (110) facets were modeled with 4 atomic layers, the (100) facet was constructed with 8 atomic layers, and the (321) and (32 $\overline{1}$) terminations were built with 16 atomic layers. The number of layers used to construct each surface was determined by their openness degree. In all cases, the half bottom layers were kept fixed to mimic the bulk while the half upper layers were fully relaxed. A 15 Å vacuum region between slabs and a dipole correction along the *z*-axis were employed.

The studied Au facets were described with different models: $\mathrm{Au}(111)$ and $\mathrm{Au}(100)$ were represented by $\mathrm{p}(4\times4)$ slabs, $\mathrm{Au}(110)$ was modeled by a $\mathrm{p}(3\times3)$ slab, and $\mathrm{Au}(321)$ and $\mathrm{Au}(32\overline{1})$ were described by $\mathrm{p}(2\times2)$ slabs. The Brillouin zone for all models was sampled by a $3\times3\times1$ k-point mesh generated through the Monkhorst–Pack method. The crystal morphology model for the Wulff construction was created using VESTA (Visualization for Electronic and STructural Analysis) version 4.5.0. The shapes were described as a function of surface energies and the symmetry point group of the nanoparticle. Because the presence of the chiral ligand distorts the otherwise equivalence of $\mathrm{Au}(321)$ and $\mathrm{Au}(32\overline{1})$ enantiomeric facets, we performed a descent in symmetry from $\mathrm{F}_{m\text{-}3m}$ to F_{432}^{20} to remove all mirror planes when computing equilibrium shapes.

All inputs and final structures can be found in ioChem-BD, ^{66,67} an open access repository for computational data. ⁶⁸

■ RESULTS AND DISCUSSION

In the present work, we explore the configurational space of L-cysteine adsorbed on different gold surfaces, compute the adsorption energies at low and high coverages, and derive the thermodynamic equilibrium shapes of AuNPs.

The different gold terminations considered in this study are shown in Figure 2a. Au(111), Au(100), and Au(110) are achiral low-Miller-index surfaces, while Au(321) and Au(32 $\overline{1}$) correspond to high-Miller-index ($h \neq k \neq l$ and $h \cdot k \cdot l \neq 0$) surfaces that exhibit chiral kinks. Based on the Cahn–Ingold–Prelog rules for organic molecules, the surface nomenclature for Au(321) and Au(32 $\overline{1}$) would be R and S, respectively. The computed surface energies γ_s for the achiral Au(111), Au(100), and Au(110) facets are 1.42, 1.54, and 1.59 J m⁻², respectively. Such a trend is in line with the literature, 70,71 although the values slightly differ when using Grimme D2⁷² with modified parameters for the metal S to describe van der Waals interactions (Table S1). The S value for both enantiomeric facets Au(321) and Au(32 $\overline{1}$) is 1.59 J m⁻², similar to that for Au(110).

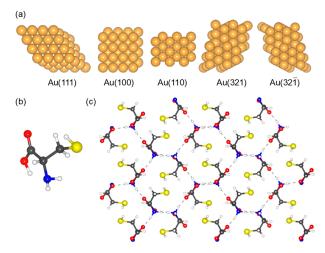


Figure 2. (a) Au facets considered in this study. (b) Optimized gasphase structure of L-cysteine. (c) Optimized crystal lattice of L-cysteine. Legend: Au = orange, S = yellow, O = red, N = blue, C = gray, and H = white.

As for the ligand, L-cysteine is usually found in zwitterionic form in both the solution and solid state. However, in the gas phase only the neutral structure exists. ⁷⁴ Indeed, all attempts to optimize zwitterionic species in the gas phase led to neutral compounds (Figure 2b). To properly describe its zwitterionic nature, we optimized the unit cell of a crystal structure of L-cysteine (Figure 2c), ⁷⁵ which contains four molecules in zwitterionic form connected through a H-bonding interaction network between [NH₃]⁺ and [COO]⁻ fragments (optimized NH···O distances in the range 1.7–1.9 Å). As reference to compute subsequent adsorption energies, we use the solid-state energy. ⁷⁶

The adsorption energies $E_{\rm ads}$ of L-cysteine on the different Au surfaces were computed using the following expression:

$$E_{\text{ads}} = E_{\text{S-L}} - E_{\text{S}} - nE_{\text{L}} \tag{1}$$

where $E_{\rm S-L}$ is the energy of L-cysteine on the metal surface, $E_{\rm S}$ is the energy of the metal surface, $E_{\rm L}$ is the energy of one L-cysteine ligand from the optimized crystal structure, and n is the number of molecules adsorbed.

Adsorption Energies at Low Coverage. In this section, we report the adsorption energies of only one L-cysteine molecule on different Au surfaces to model a low concentration of organic modifier. We ensured that our slab models reproduce a low coverage scenario since the periodic images of L-cysteine were separated by at least 4.7 Å.

First, we fully explored the configurational space of one L-cysteine molecule on Au(111) and Au(321) surfaces by considering up to six different configurations as shown in Figure 3. A1 describes the zwitterionic form found in the crystal structure (Figure 2c) with a SH group bound to the surface. However, in the absence of H-bond interactions between neighboring molecules, such a configuration is not stable and evolved toward neutral species on both surfaces. A2 also corresponds to a zwitterionic form where the negative charge is placed on the sulfur atom bound to the surface. B stands for a neutral species with a SH group. C1 and C2 stand for zwitterionic and neutral states with a deprotonated sulfur atom, where the H is included as 1/2 of H₂. Similar to A, only the neutral form C2 is stable. Finally, D describes the dissociation of the S–H bond on the surface.

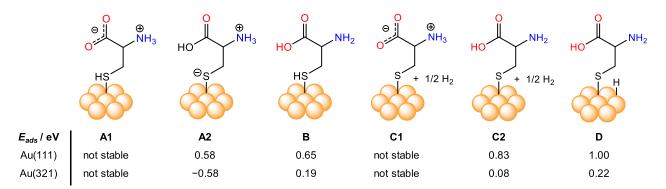


Figure 3. Configurational space of L-cysteine adsorbed on selected facets, Au(111) and Au(321).

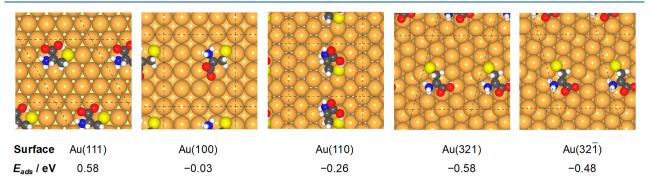


Figure 4. Most stable low-coverage structures and E_{ads} (eV) for Au surfaces. Legend: Au = orange, S = yellow, O = red, N = blue, C = gray, and H = white.

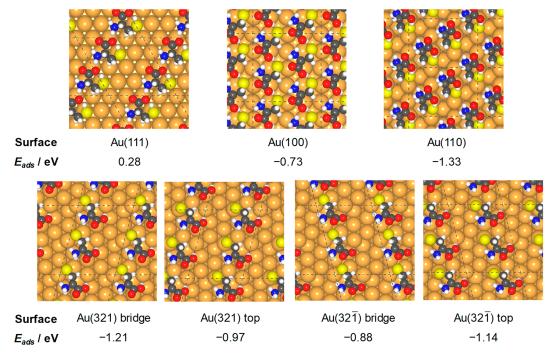


Figure 5. Most stable high-coverage structures and $E_{\rm ads}$ (eV) for Au surfaces. Legend: Au = orange, S = yellow, O = red, N = blue, C = gray, and H = white.

The adsorption energies of the most stable conformers for the previously described configurations are collected in Figure 3, where the zero of energies corresponds to the clean surface plus one L-cysteine molecule. For Au(111), the most stable configuration is A2 with an $E_{\rm ads}$ of 0.58 eV. The presence of the

[S] moiety in A2 agrees with the well-known affinity between thiolate groups and gold. It is worth noting that all adsorption processes on Au(111) are endothermic due to the stability of (i) the crystal structure taken as reference and (ii) the low-Miller-index surface. When considering an isolated

L-cysteine molecule in the gas phase as reference (prime notation), all adsorption energies E_{ads} become exothermic, being A2 again the most stable configuration with an $E_{\rm ads}$ of -1.02 eV (Table S2). The Au(321) surface follows the same trend, where A2 is again the most stable structure. However, because of the lower stability of Au(321) compared to Au(111), the $E_{\rm ads}$ is now exothermic with a value of -0.58 eV. When the gas-phase reference is used, the E_{ads} increases up to -2.19 eV (Table S2).

Figure 4 shows the optimized structures and $E_{\rm ads}$ for all low coverage situations in the studied Au facets (a thorough study of structures on chiral surfaces can be found in Table S3). The most favorable adsorption site is top for Au(111), bridge for Au(100) and Au(110), and bridge of a step for Au(321) and $Au(32\overline{1})$. Adsorption processes are endothermic for Au(111)with $E_{\rm ads}$ of 0.58 eV, isoenergetic for Au(100), and exothermic for Au(110), Au(321), and Au(32 $\overline{1}$) with E_{ads} of -0.26, -0.58, and -0.48 eV, respectively. With regard to chiral surfaces, the [S] group binds at the same bridge site of the step for both facets, while the relative position of the amino [NH₃]⁺ and the carboxylic acid [COOH] moieties with respect to the terrace is different. These structures represent 3-point contact models for chiral recognition. ⁴⁸ As a result, the adsorption of L-cysteine is preferred on Au(321) compared to Au(32 $\overline{1}$) by 0.10 eV, in line with recent experiments. 20 Such an energy difference would break the symmetry between terminations and induce an enantio-enriched growth of AuNPs.

Adsorption Energies at High Coverage. We next consider the adsorption of several L-cysteine molecules on Au facets to mimic a high coverage situation. Following the results from Figure 3, we only evaluated the configurations A1, A2, and B.

To estimate the number of molecules required to mimic a high coverage for all considered models, we extensively explore conformations with up to four L-cysteine molecules on each Au surface. Using adsorption energies per molecule as criterion (Table S5), we report Au(111), Au(321), and Au(32 $\overline{1}$) with two molecules, Au(110) with three molecules, and Au(100) with four molecules."

The most stable structures for each surface are shown in Figure 5 (a thorough study of structures on chiral surfaces can be found in Table S4). For Au(111), the configuration A1 is the most favored with an overall $E_{\rm ads}$ of 0.28 eV. We observe intermolecular H-bond interactions between [NH3]+ and [COO] moieties with H···O distances of ca. 1.6 Å, which are comparable to the patterns found in the crystal (Figure 2c). This structure also exhibits intramolecular contacts between adsorbed [SH] and [COO] that were absent in the crystal. For Au(100) and Au(110), the thiolate configurations A2 are the most stable, with exothermic E_{ads} values of -0.73 and -1.33 eV, respectively. The Au(100) structure features intermolecular H-bond interactions between [NH3]+ and [COOH]. With regard to the facet Au(321), two L-cysteine molecules preferentially bind at bridge positions with an E_{ads} of -1.21 eV, in line with the results at low coverage, while the top configuration has an $E_{\rm ads}$ of -0.97 eV. However, for the facet Au $(32\overline{1})$, the structure at bridge sites (-0.88 eV) creates close contacts between neighboring molecules (distances O...[S] of ca. 3.3 Å). In such a situation, the [S] groups move to top positions to yield a more favorable $E_{\rm ads}$ of -1.14 eV. The energetic preference of 0.07 eV toward Au(321) is similar to that of 0.10 eV found for the low-coverage scenario.

With regard to solvation, this study does not consider explicit water molecules, which would require the use of molecular dynamics simulations with reactive⁷⁸ and polarizable⁷⁹ force fields. Although water molecules will unlikely compete with L-cysteine for surface sites on Au, they can indeed act as proton shuttles during adsorption mechanisms.4 Nevertheless, because of the strong interaction between Au and S in gold-cysteine interfaces, a gas-phase approach already provides useful trends as far as chiral discrimination concerns.

Equilibrium Shape of Au Nanoparticles. With γ_s of clean Au facets and $E_{\rm ads}$ of L-cysteine at hand, we computed the adsorption-corrected γ_s , which describes the interface tension between Au and the amino acid for low and high coverage according to the following equation:

$$\gamma_{\rm s}' = \gamma_{\rm s} + E_{\rm ads}/A \tag{2}$$

The results are collected in Table 1. As expected for the clean system, the most stable surface termination is Au(111). At low

Table 1. Clean γ and Corrected γ' Surface Energies (J m⁻²) for Au Facets

	γ_{s}' (J m ⁻²)				
	(111)	(100)	(110)	(321)	$(32\overline{1})$
clean ^a	1.42	1.54	1.59	1.59	1.59
low coverage	1.50	1.54	1.56	1.52	1.53
high coverage	1.46	1.46	1.39	1.44	1.45
^a The experimental surface energy for Au is 1.54 I m ^{-2,80}					

The experimental surface energy for Au is 1.54 J m ~.

coverage the γ_s values are rather close for all facets, while at high coverage such a trend changes, and Au(110) appears as the most stable surface.

Thermodynamic models based on Wulff constructions are then computed using γ_s for clean surfaces and γ_s for low- and high-coverage terminations. With regard to the symmetry of the NP, all facets in the F_{m-3m} point group are chemically equivalent. However, to account for the chirality introduced by L-cysteine, we descent to the F_{432} point group to remove all mirror planes and break the symmetry between enantiomeric surfaces.

The resulting equilibrium shapes and the contributions of each surface as percentage are shown in Figure 6. For the clean system, the dominant surface is Au(111) with 47% followed by Au(100) with 23%. The rest of terminations only account for 10% each one. This shape is similar, but not the same, as the truncated octahedron found in previous reports. 55,81,82 Such a deviation is attributed to the van der Waals approach employed, which is known to impact surface properties. Surfaces energies computed via Grimme D2⁷² with modified parameters for the metal⁷³ did provide the expected truncatedoctahedral shape (Figure S1).

At low coverage, the effect of the organic ligand is quite significant. The previously dominant Au(111) and Au(100) surfaces drop to 12% and 15%, respectively. In turn, the contribution from both chiral surfaces increases up to 68%. Interestingly, while the chiral facets were equivalent in the clean particle (10% each), the presence of L-cysteine drives the enantiomeric differentiation favoring Au(321) (38%) over $Au(32\overline{1})$ (30%). At high coverage, Au(111) goes further down to 5% while Au(100) remains at 15%. The enantiomer Au(321) (30%) still predominates over Au(321) (23%), but the overall contribution from both chiral surfaces decreases to

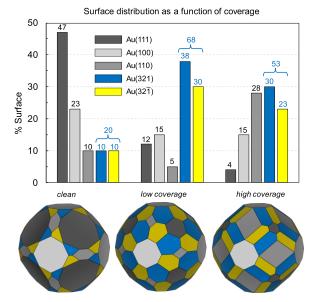


Figure 6. Wulff constructions of clean, low coverage, and high coverage of L-cysteine on AuNPs and surface distribution (%).

53% at the benefit of Au(110), which increases from 5% to 28%. Therefore, although the relative enantiomeric discrimination is similar for both low- and high-coverage scenarios (8% and 7%, respectively), the percentage of chiral surfaces is smaller for the latter one (68% and 53%, respectively).

CONCLUSIONS

We present periodic DFT simulations combined with Wulff constructions to understand the enantiomeric enrichment driven by the amino acid L-cysteine on chiral gold surfaces. At low ligand coverage, the adsorption energy of L-cysteine on Au(321) is higher than that on Au(321), which promotes the enantiomeric discrimination of terminations during thermodynamic nanoparticle growth. At high ligand coverage, the trend remains the same, but now the contribution from chiral surfaces becomes smaller due to stabilizing on the achiral facet Au(110). Overall, we reveal the origin of the chiral induction by surface modifiers and demonstrate how the use of computational techniques can be employed as predictive tools for chiral nanostructures.

ASSOCIATED CONTENT

S Supporting Information

Additional energies and structures (PDF)

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Notes

The authors declare no competing financial interest.

ACKNOWLEDGMENTS

J.M.V. thanks Fundació la Caixa for a Summer Fellowship. M.A.O. acknowledges Juan de la Cierva Incorporación (IJCI-2016-29762) and Beatriu de Pinós (2017-BP-00039) fellowships for financial support. The authors acknowledge generous computer resources at Caesaraugusta and technical support provided by BIFI University of Zaragoza (RES-QCM-2018-3-0005).

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