

Macrospin model of an assembly of magnetically coupled core-shell nanoparticles

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Highly sophisticated synthesis methods and experimental techniques allow for precise measurements of magnetic properties of nanoparticles that can be reliably reproduced using theoretical models. Here, we investigate the magnetic properties of ferrite nanoparticles by using theoretical techniques based on Monte Carlo methods. We introduce three stages of sophistication in the macromagnetic model. First, by using tailor-made Hamiltonians we study single nanoparticles. In a second stage, the internal structure of the nanoparticle is taken into consideration by defining an internal (core) and external (shell) region, respectively. In the last stage, an assembly of core-shell nanoparticles is considered. All internal magnetic couplings such as interatomic and intra-atomic exchange interactions or magnetocrystalline anisotropies have been estimated. Moreover, the hysteresis loops of the aforementioned three cases have been calculated and compared with recent experimental measurements. In the case of the assembly of nanoparticles, the hysteresis loops together with the zero-field-cooling and field-cooling curves are shown to be in a very good agreement with the experimental data. The current model provides an important tool to understand the internal structure of the nanoparticles together with the complex internal spin interactions of the core-shell ferrite nanoparticles.

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I. INTRODUCTION

Various technological fields have motivated the design and fabrication of nanostructures with the ability of tailoring the magnetic properties. The category of magnetic nanoparticles (NPs) is interesting from both fundamental and technological points of view [1–6]. Thus, for example, ferrite nanoparticles with the general formula of $MM\text{Fe}_2\text{O}_4$ ($M = \text{Fe}, \text{Co}, \text{Ni}$ and Mn) have attracted great attention of researchers due to their potential applications in biomedicine and industry [2]. In particular, spinel ferrites are an attractive class of ferrimagnets offering both soft and hard phases as well as a common crystal structure that allows for a high-quality crystal interface between core and shell layers [7]. The metallic ions are located at either octahedral coordinated sites, also called B sites, or forming a tetrahedral geometry, denoted as A sites. The ratio of the occupation of these sites produces different spinel structures defined by the inversion degree number X . The normal and inverse spinel structures represent the two limiting cases with $X = 0$ and 1 , respectively. Between these two limits, a mixed spinel exists where the divalent transition metal M is distributed between sites A and B [8,9]. A value of $X = \frac{2}{3}$ represents a random distribution of metallic ions

between sites A and B . The degree of inversion can affect the magnetic properties of ferrites as, for example, saturation magnetization and coercive field [10,11]. Ferrites are found to have a ferrimagnetic ordering, which is due to the dominant antiferromagnetic exchange between sites A and B [8,9].

The inverse spinel structure is of paramount importance for the current work where Fe^{3+} cations are equally distributed at both A and B sites while the divalent M ions are found only at octahedral sites. In this work, CoFe_2O_4 (CFO) was selected due to its high anisotropy that should limit the degree of canting as spins will be more tightly bound to the crystal lattice compared to Fe_3O_4 (FO), which has a relatively high moment but much lower anisotropy. A common crystal structure and negligible differences in lattice constant between the two materials ($8.40 \text{ \AA}$ for FO, $8.39 \text{ \AA}$ for CFO [8]) enable synthesis of high-quality core-shell NPs and, consequently, a bimagnetic structure of these two compounds can be constructed without introducing large lattice mismatch distortions. Moreover, as CFO is in a hard magnetic phase while FO is in a soft magnetic phase at normal conditions, the combination of these compounds can possess interesting exchanged-coupled related properties.

Thus, two combinations of core-shell NP assemblies have already been synthesized and magnetically characterized [12]. More specifically, a conventional assembly of NPs is experimentally synthesized by adding CFO to the core of the NP and capping the core with a shell of FO (CFO@FO). The inverted assembly is achieved by placing FO in the core and adding CFO in the shell (FO@CFO). In order to give a better understanding of their underlying reversal mechanisms, we employ Monte Carlo (MC) atomistic simulations for both types of assemblies based on tailor-made Hamiltonians. Atomistic

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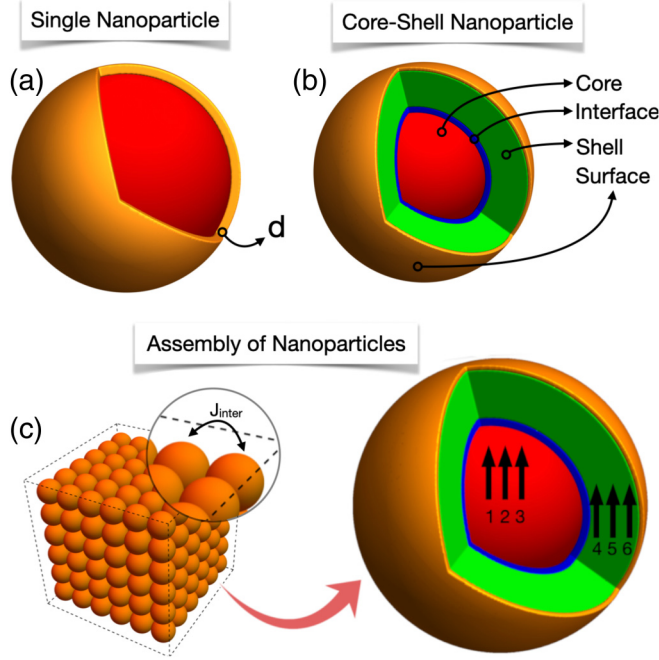


FIG. 1. Since the studied nanoparticles are very small in size, the surface effects become very important. Thus, we sketch in (a) a spherical single nanoparticle with the region in gold representing the portion of the nanoparticle that belongs to the surface. The width of the surface is denoted by d . In (b), a core-shell nanoparticle is shown with the different regions indicated by using different colors. Finally, in (c) is represented an assembly of core-shell nanoparticles, while on the right is drawn the internal structure of a single nanoparticle taken from the assembly. The arrows represent the macrospins used in the model.

simulations on isolated ferrite particles have already been performed [13,14] in order to study surface and shape effects. For the assembly of the nanoparticles, macrospin model approaches have also been used to study coated CFO particles with three macrospins per particle [15,16].

In this work, we introduce progressively different degrees of sophistication of the model. Initially, we performed MC simulations for single nanoparticles taking into account the different coordination of A and B sites. We vary several of their internal degrees of freedom in order to examine how interface and surface effects affect their magnetic response. In a second stage, the Hamiltonian is improved to describe a single nanoparticle composed of a central region denoted as core and an external shell region. The Hamiltonian also considers the interface effects between the core and shell regions. Finally, the Hamiltonian and, consequently, the macrospin model are recasted in a more sophisticated form so that the model now is capable to describe not only single nanoparticles with internal structure but also an assembly of core-shell nanoparticles. Thus, we end up with a six macrospin models per particle where not all spins interact with each other explicitly. In that way, the model is able to provide a better description of the interface of the particles and, consequently, is in a very good agreement with the experimental data, especially at low temperatures [12]. A description of the three NP systems is shown in Fig. 1. Moreover, we also indicate in several

TABLE I. Bulk exchange-coupling constants for CFO and FO with different interaction transition-metal (TM) atomic sites. All values are given in energy units of mRy.

CFO	TM _{<i>i</i>}	TM _{<i>j</i>}	<i>i</i>	<i>j</i>	J_{ij}
	Fe	Fe	A	A	−0.094
	Fe	Co	A	B	−0.143
	Fe	Fe	A	B	−0.164
	Co	Co	B	B	0.296
	Fe	Co	B	B	−0.117
	Fe	Fe	B	B	−0.047
FO	Fe	Fe	A	A	−0.132
	Fe	Fe	A	B	−0.150
	Fe	Fe	A	B	−0.177
	Fe	Fe	B	B	0.308
	Fe	Fe	B	B	−0.08
	Fe	Fe	B	B	−0.06

colors the regions of the nanoparticles that are essential to understand the different terms considered in the Hamiltonians given by Eqs. (1)–(3). According to literature, the type of magnetocrystalline anisotropy of FO and CFO is mainly cubic [8,9]. Notably, it has been reported that for small ferrite particles, a symmetry transition from cubic anisotropy to uniaxial anisotropy can take place [17–20]. In consequence, in the current model we only consider magnetocrystalline uniaxial anisotropy.

II. MODEL AND RESULTS

Initially, we employed atomistic Monte Carlo simulations with the implementation of the Metropolis algorithm of isolated nanoparticles composed of CoFe_2O_4 and Fe_3O_4 . The Hamiltonian used for the calculations is

$$\mathcal{H} = - \sum_{i,j} J_{ij} \mathbf{S}_i \cdot \mathbf{S}_j - \sum_i K_i \cos^2 \theta_i - g \mu_B \sum_i \mathbf{B} \cdot \mathbf{S}_i, \quad (1)$$

where i, j denote first-neighbor atomic positions and $\mathbf{S}_i$ is the atomic magnetic moment. The first term describes the Heisenberg exchange interaction J_{ij} between atomic sites i and j . The ansatz given in Eq. (1) implies that a ferromagnetic (antiferromagnetic) interaction is described by a positive (negative) exchange coupling. In the second term, a uniaxial atomic magnetic anisotropy of strength K_i is introduced to collect the spin-orbit effects. The angle θ_i defines the deviation of the atomic magnetic moment ($\mathbf{S}_i$) with respect to the atomic easy-axis anisotropy. The last term represents the Zeeman term under the influence of a global external magnetic field. For the very small sizes in diameter of the nanoparticles considered here (~ 6 nm for CFO and ~ 7 nm for FO), the surface effects become important, and thus, for all the simulated systems, unless stated otherwise, we define a surface shell thickness of width d [cf. Fig. 1(a)]. The width d is chosen to be equal to the unit-cell length of the associated material. For the core spins, the easy-axis anisotropy is set along z direction whereas for the surface atoms the anisotropy axis direction is randomly selected for each spin site in agreement with experimental evidence [12]. Bulk J_{ij} values are collected in Table I for CFO and FO nanoparticles [21]. Likewise, the bulk values of the

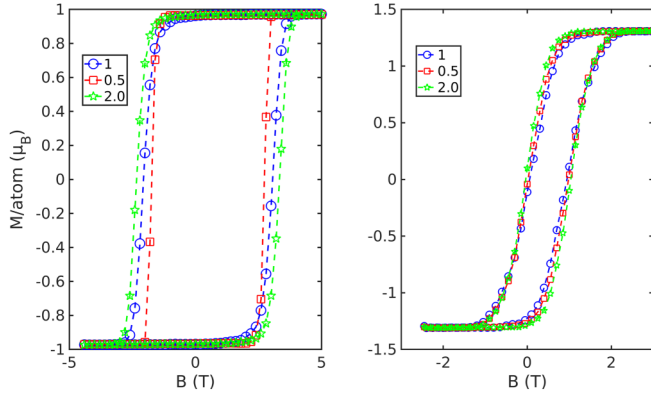


FIG. 2. Calculated hysteresis loops for CFO (left panel) and FO (right panel) single nanoparticles for different ratios of the surface anisotropy with respect to the core anisotropy (K_i^s/K_i^c) at a temperature of 5 K.

magnetic anisotropy for the core region [red color in Fig. 1(a)] of the nanoparticles are $k_i = 0.0036$ and 0.000112 mRy per atom for CFO and FO, respectively [8,9]. Both CFO and FO have an inverse spinel structure, i.e., the divalent ion (Co^{+2} for CFO and Fe^{+2} for FO) is found only in B sites. The Co^{+2} ion has a moment of $3.0 \mu_B/\text{atom}$, whereas Fe^{+2} presents a moment of $4.0 \mu_B/\text{atom}$. In both samples, Fe^{+3} ions have a moment of $5.0 \mu_B/\text{atom}$. The spherical particles with radius r are constructed by replication of the bulk inverse spinel structure. The spherical shape is reproduced by removing the unit cells that are a distance bigger than r away from center of the nanoparticle.

The Monte Carlo simulation for a given temperature and an external field were averaged over 10 samples with different initial seeds. For every field value, the first 1000 MC steps per spin are used for thermal equilibration and 20 000 additional MC steps per spin are used to extract thermal averages. For every MC step the trial moves are chosen within a cone with respect to the current spin direction. For every temperature, the initial cone angle is chosen as to be able to completely flip each spin. The cone angle ϕ is refined with respect to the acceptance ratio, as $\phi_{\text{new}} = \phi_{\text{old}} + d\phi$. The refinement step $d\phi$ is introduced as a quadratic function $d\phi = (0.5 - A)^2 \text{sign}(A - 0.5)$. At every field step, the initial angle is chosen as the cone angle of the previous step multiplied by a safety factor of 1.2. This safety factor allows to directly perturb the system before applying the refinement. This setup allowed us to have an acceptance ratio of 50%.

Figure 2 shows hysteresis loops for CFO and FO single nanoparticles at $T = 5$ K by varying the strength of the surface anisotropy (K_i^s) with respect to the one of the core (K_i^c). As surface atoms interact with a number of neighboring oxygen atoms smaller than the number of oxygen atoms interacting with bulk atoms, the exchange couplings of the surface atoms are expected to be smaller than the exchange couplings for bulk atoms. Thus, we set $J_{ij}^s/J_{ij}^c = 0.5$. This value is chosen on a perfect spherical surface formed by a cubic unit cell with the mean value of the coordination number dropping to half in the surface. Thus, by setting the aforementioned ratio to 0.5 we assume that, in mean average,

TABLE II. Structural parameters of CFO@FO and FO@CFO nanoparticles. All values are given in distance units of nm.

	Core radius	Shell thickness	Diameter
CFO@FO	2.9	1.7	9.2
FO@CFO	3.5	1.3	9.6

the coordination number in the surface is half of the one for the atoms in the bulk. FO single nanoparticles clearly show a larger saturation magnetization with a value of $1.31 \mu_B/\text{atom}$ with respect to CFO which has a value of $0.97 \mu_B/\text{atom}$. On the contrary, CFO possesses a larger coercive field reaching a value ~ 2.5 T. It is worthwhile to mention here that the variation of the coercive field with respect to the ratio K_i^s/K_i^c is almost negligible, in particular, for FO single nanoparticles. This is a direct consequence of the the randomly easy-axis distribution of the surface atoms.

By increasing the level of sophistication of the model, we proceed to the calculation of single core-shell nanoparticles for the two aforementioned combinations, i.e., CFO@FO and FO@CFO. In order to study the core-shell morphology, we introduce the following Hamiltonian:

$$\mathcal{H} = - \sum_{i,j}^{\text{core}} J_{ij} \mathbf{S}_i \mathbf{S}_j - \sum_{i,j}^{\text{interf}} a_i J_{ij} \mathbf{S}_i \mathbf{S}_j - \sum_{i,j}^{\text{surf}} a_s J_{ij} \mathbf{S}_i \mathbf{S}_j - \sum_i a_k K_i \cos^2 \theta_i - g \mu_B \sum_i \mathbf{B} \mathbf{S}_i. \quad (2)$$

In Eq. (2), we have introduced two additional terms which separate the interface and surface effects from the bulk of the nanoparticle. We assume that both the width of the surface (d_s) and interface (d_i) are equal to the CFO unit-cell constant, i.e., $d_s = d_i = 0.835$ nm. As both CFO and FO possess the same inverse spinel structure and very similar lattice constant, we would expect an almost perfect match in the interface. However, due to the spherical shape of the nanoparticle and, consequently, the curvature of the interface, there is still a slight mismatch between the boundaries in the interface which produces a nonzero surface tension. For the aforementioned reasons, in the current model we assume that the spinel structure is preserved but it is slightly distorted on the interface and surface. The distortion is introduced by rescaling the exchange constants J_{ij} on the interface by the factor a_i and on the surface by a_s . The initial value of J_{ij} on the interface is assumed to be the mean average of the sum of J_{ij} of the associated bulk values of the different structures. Unless stated elsewhere, a_s has a value of 0.5, i.e., on the surface we assume that interaction strengths drop to the half value than the one found in the bulk. As a consequence, we assume the anisotropy becomes randomized on the surface but uniaxial on the interface. The structural parameters of the core-shell nanoparticles studied here are given in Table II.

It has to be noted here that the sizes of both types of core-shell nanoparticles are far below the coherent radius limit of $3.6 l_{\text{ex}}$, where l_{ex} is the exchange length [22]. Typical values of the exchange length are 4.9 and 5.2 nm for Fe_3O_4 and CoFe_2O_4 bulk systems, respectively [8]. Thus, the formation of magnetic domains is very unlikely. In consequence,

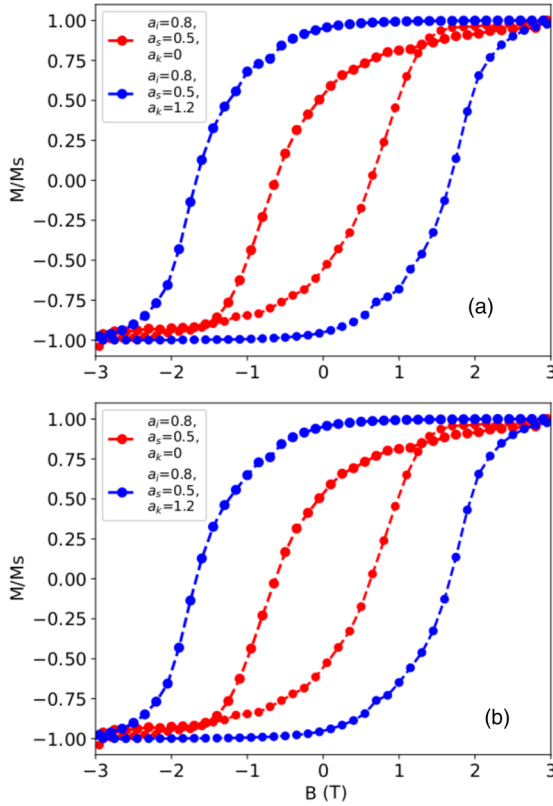


FIG. 3. Hysteresis loops for (a) CFO@FO and (b) FO@CFO core-shell nanoparticle at 5 K. Loops are plotted for different scaling factors a_i , a_s , and a_k .

the magnetization reversal process can only be attributed to incoherent states on the interface or surface. Figure 3 shows hysteresis loops at 5 K for CFO@FO and FO@CFO core-shell nanoparticles, respectively. The anisotropy scaling parameter per atom is represented by a_k . The hysteresis loops are plotted for different scaling factors, i.e., a_i , a_s , and a_k . Both types of nanoparticles possess similar properties as single particles. Also in the range from -3 T to 3 T in the applied external magnetic field, none of the CFO@FO and FO@CFO core-shell nanoparticles possess a full closed loop. However, by scaling (reducing) the exchange constants on the interface without magnetocrystalline anisotropy, the aforementioned effect is highly reduced although it is worthwhile to mention here that the core-shell nanoparticles still have a nonzero coercive field [cf. red curves in Figs. 3(a) and 3(b)]. The latter arises from the fact that the mismatch between the core and shell introduces canting in the interface spins and thus induces an increase of the exchange anisotropy of the system. Introduction of magnetocrystalline anisotropy into the nanoparticles led to an increase in the coercive field. For example, for a scaling factor $a_k = 1.2$, the coercive field is calculated to be 2.3 and 1.9 T for FO@CFO and CFO@FO, respectively.

In order to understand the reversal process, in Figs. 4(a) and 4(b) we show the ratio of the cosine of the core's magnetization polar angle with respect to the one for the shell, interface, or surface for both nanoparticles, i.e., CFO@FO [see Fig. 4(a)] and FO@CFO [see Fig. 4(b)]. In both systems,

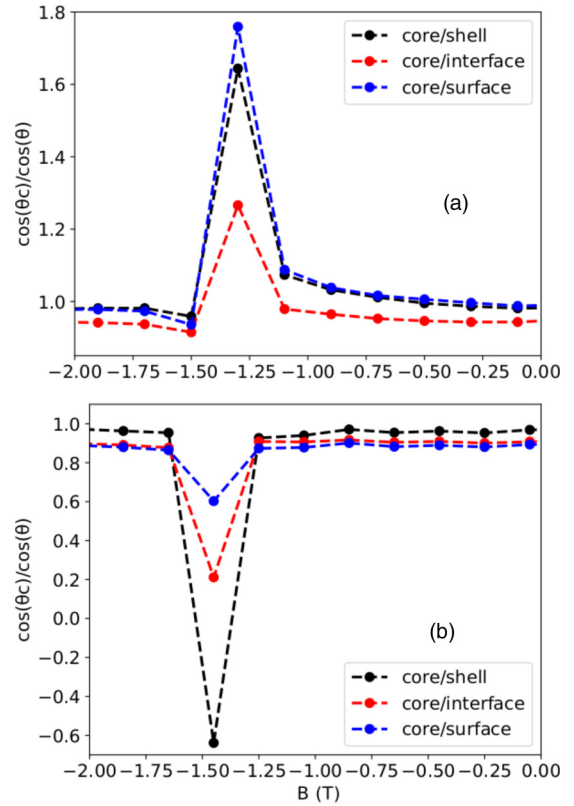


FIG. 4. Variation of the of the core's magnetization polar angle with respect to the one for the shell (black) interface (red) and surface (blue) for (a) CFO@FO and (b) FO@CFO systems.

the core does not possess the same angle with respect to the shell, indicating a noncoherent reversal of the particle. For the CFO@FO case, the aforementioned ratio is found to be positive for every external field value. The core and shell have all the time the same orientation but a different angle with respect to the external field direction. On the other hand, for the FO@CFO system, in the neighborhood of the coercive field, the ratio shown in Fig. 4(b) has negative values between the core and the shell showing a larger angle difference than 90° . The soft core has already reached negative values whereas the hard shell is still having positive ones.

For exchange-coupled systems, the exchange interaction on the interface is a critical parameter regardless of the soft or hard phase of the nanoparticle. Figure 5 shows the variation of the coercive field with respect to the interface scaling factor for CFO@FO nanoparticle at 5 K for two different values of the anisotropy scaling factor. In the limit of no interface coupling ($a_i \rightarrow 0$), the coercive field approximates to that of the hard phase. For both anisotropy scaling parameters, the coercive field possesses a nonmonotonic behavior. When the anisotropy constant approaches the bulk values, i.e., $a_k \rightarrow 1$, the coercive field continuously decreases but the decay is broken in the interval $[0.3, 0.5]$. In this region, the coercive field curve shows a plateau with a very tiny increase. After this value the decrease rate reduces, i.e., the coercive field decreases but with a smaller slope. On the other hand, for $a_k = 1.2$ the coercive field shows a peak for $a_i \sim 0.2$, so that, the interface effects induce magnetic fluctuations for

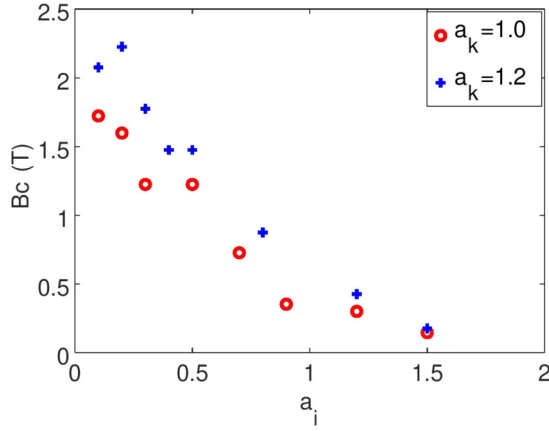


FIG. 5. Coercive field as a function of the interface scaling factor a_i for CFO@FO nanoparticles.

such coupled systems. Notably, the hardness of the bimagnetic systems is heavily dependent on the interplay between the anisotropy barrier and the exchange interactions on the interface. As already mentioned above, the disorder induced by the interface effects, even under the absence of strong anisotropy, results in a nonzero coercive field. By increasing of the anisotropic scaling factor, a high coercive field can be reproduced with a small interface coupling factor. On the other hand, for the anisotropy bulk value case, a very strong interface coupling must be considered in order to achieve the maximum coercive field. Therefore, a nanoparticle system requires an almost perfect interface with negligible imperfections or dislocations. Consequently, we propose that for these bimagnetic nanoparticle systems, the interface should show an enhanced anisotropy. Otherwise, a strong exchange coupling should be present, which is in contrast with a nonperfect structural interface.

Apart from the coercive field, the remanent magnetization is a critical parameter for magnetic applications. Figure 6 shows the evolution of the normalized remanent magnetization with respect to the interface scaling factor. For both $a_k = 1.0$ and 1.2 , the remanent magnetization shows an increasing trend up to a critical value of the interface scaling

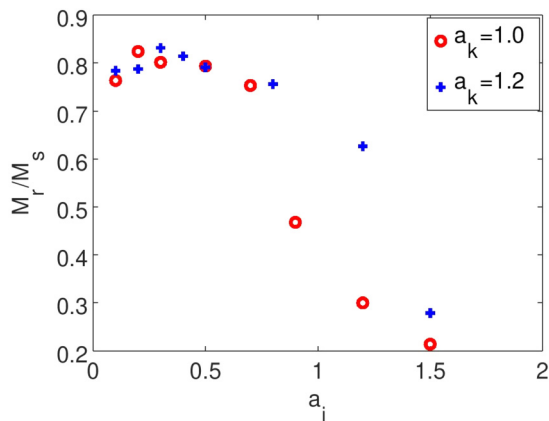


FIG. 6. Variance of the normalized remanent magnetization for CFO@FO nanoparticle with respect to interface scaling factor a_i .

factor $a_i = 0.3$ and then clearly reduces down to a value of $M_r/M_s = 0.2$. For both anisotropy scaling factors, the M_r/M_s ratio show a maximum close to 0.8.

Independently from the interface coupling, the surface is free to start a reversal process due to reduced coordination of the atomic spins. From our simulations it is found that, in order to reach the maximum M_r/M_s , a larger value of the interface coupling constant is needed, with respect to the one for the maximum coercive field. As the surface and interface are already disordered, an even stronger coupling between the phases is needed in order for the soft phase to overrule and rise the remanent state. Interestingly, though, when the M_r/M_s is at its maximum value still the nanoparticle possesses a considerable coercive field as the disorder of the interface does not allow for a full reversal process to be completed. Despite that, it is clear that in ferrites the exchange interactions are extremely strong and play a major role in the magnetic behavior. As seen in Figs. 5 and 6, even with a scaling of $a_k = 1.2$ for a value of $a_i = 0.3$, a clearly exchanged-coupled behavior can be achieved. Moreover, the size of the particle is also extremely important as it does not allow for any kind of domain formation [22]. Notice that a value of $a_i > 1$ would imply that the exchange coupling is larger than the corresponding one in the bulk. Although it seems to be an unphysical case, we show in Figs. 6 and 5 cases with $a_i > 1$ just to provide a complete numerical parametric study.

Experimental measurements have been performed on dense assemblies of CFO@FO and FO@CFO core-shell nanoparticles [12]. Under these experimental conditions, the dipolar interaction can affect the magnetic response, especially for NPs composed of CFO and FO due to their considerable magnetic moments. As the size of the particles is below the coherent radius limit, in order to study the assembly in a computationally efficient form, we develop a coarse-grain macrospin model for each nanoparticle. To be more specific, we used three to six macrospins per particle. Under this level of theory, we recast the Hamiltonian in the following form:

$$\mathcal{H} = - \sum_{i,j} J_{ij} \mathbf{S}_i \mathbf{S}_j - \sum_{m,n} J_{\text{inter}} \mathbf{M}_m \mathbf{M}_n + \sum_{m,n} \mathbf{M}_m [D] \mathbf{M}_n - \sum_i k (\cos)^2 \theta_i - g \mu_B \sum_i \mathbf{S}_i \mathbf{B}, \quad (3)$$

where $\{\mathbf{S}_i\}$ represent the moment of macrospins within a nanoparticle while $\{\mathbf{M}_n\}$ is the net moment of particle n , so that indices $\{i, j\}$ denote summation within a nanoparticle (intranoparticle interaction) while $\{m, n\}$ denote summation between nanoparticles (internanoparticle interaction). The parameter J_{ij} is the Heisenberg interaction coupling between macrospins i and j within the nanoparticle while J_{inter} describes the interparticle interactions of the Heisenberg form. The third term in Eq. (3) represents dipolar interactions between nanoparticles with $[D]$ being the dipolar tensor and it is calculated as an interaction between the net moment of each particle $\mathbf{M}_n$. The magnetic anisotropy constant is represented by k and θ_i is the angle between $\mathbf{S}_i$ and easy-axis direction while the last term represents the Zeeman contribution with $\mathbf{B}$ being the applied external magnetic field.

For each nanoparticle, the total magnetic moment is subdivided into N macrospins, N_1 for the core and N_2 for shell,

TABLE III. Heisenberg interaction constant J_{ij} for the macrospin model. All J_{ij} are given in units of mRy.

Compound	J_{12}	J_{13}	J_{23}	J_{24}	J_{34}	J_{25}	J_{35}	J_{45}	J_{46}	J_{56}
CFO@FO	3.4	3.4	-2.1	2.3	1.9	2.2	1.8	2.4	2.4	-1.8
FO@CFO	3.1	3.1	-1.8	2.1	2.2	2.3	1.7	2.8	2.8	-1.9

and the sum of the macrospins for the core and shell equals the total moment per nanoparticle, as determined from bulk magnetometry. Thus, the total moment per nanoparticle is divided between the core and shell contribution, separately. For the CFO@FO core-shell nanoparticle, the core and shell moments are estimated to be 4.14×10^{-20} Am² and 12.38×10^{-20} Am², respectively; while for FO@CFO nanoparticle, the core and shell moments are 6.80×10^{-20} Am² and 10.74×10^{-20} Am², respectively [12]. The multiple macrospins per core and shell can simulate the effects of spin canting at the core-shell and shell-vacuum interface. The ensemble of nanoparticles is simulated by placing the macrospins for each nanoparticle on a $12 \times 12 \times 12$ grid (i.e., 12^3 nanoparticles) with a mean spacing of 10 nm [12] between nanoparticles and periodic boundary conditions.

In order to define the interaction parameters, we perform a fitting procedure with the independent variable(s) being the calculated single-nanoparticle energy. The atomistic energy of the system is calculated for different magnetic configurations through Eq. (2) and mapped back into the macrospin model by using Eq. (3). As a large number of parameters for the macrospin Hamiltonian are used, we perform a fitting of the energies arising from the atomistic simulation through the entire hysteresis loop rather than a single-point energy calculation. After the initial fitting, an iterative refinement is performed in order to ensure that all fitted parameters have an error in computed energies smaller than 10^{-4} meV/atom. In Tables III and IV, we present the parameters used for the macrospin model. For both compounds, the indices {1–3} refer to the core and {4–6} to the shell. In all cases, the anisotropy was assumed to be uniaxial for each nanoparticle, and its axis was randomly selected per particle in the assembly of nanoparticles. The interparticle interaction J_{inter} was set to 0.1 mRy. The interface is chosen to be one unit cell which for FO and CFO has a lattice parameter of about 8.3–8.5 Å. For this reason, we foresee that the defined core and defined shell can interact only implicitly through the interface, rather than with a direct exchange. With the aim to reduce the number of free-fitting parameters, the macrospins labeled as {1} for the core (J_{12} and J_{13}) and {4} (J_{45} and J_{46}) for the shell are imposed to have the same exchange interaction strength per

TABLE IV. Anisotropy constant k for the macrospin model. The units of the uniaxial magnetocrystalline anisotropy are given in mRy.

Compound	Core			Shell		
	k_1	k_2	k_3	k_4	k_5	k_6
CFO@FO	7.1	13.1	13.1	8.1	7.6	0.1
FO@CFO	0.8	6.4	6.4	9.2	8.1	8.0

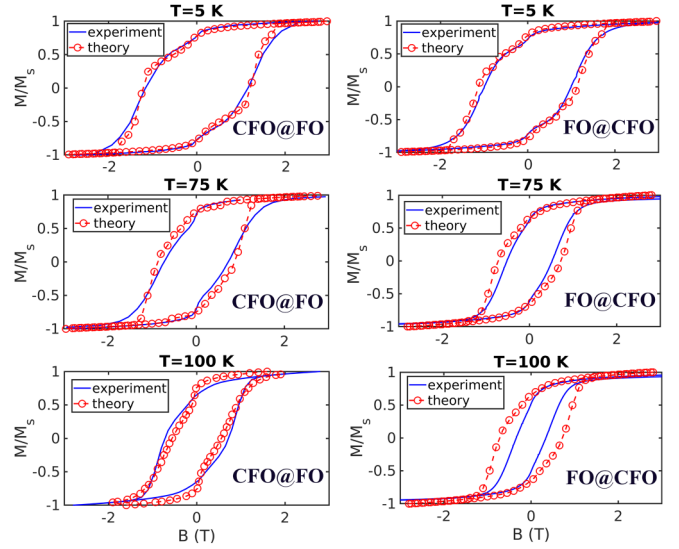


FIG. 7. Hysteresis loops for CFO@FO (left column) and FO@CFO (right column) assembly nanoparticles at several temperatures (5, 75, and 100 K). In blue is shown the experimental hysteresis loop taken from Ref. [12] for comparison with the prediction of the theoretical model.

region, i.e., $J_{12} = J_{13} = 3.4$ mRy and $J_{45} = J_{46} = 2.4$ mRy (see Table III).

In Table IV, the anisotropy contributions are distinguished between core and shell. FO region shows a considerable enhancement when it is interfaced with CFO, thus reducing the volume of the soft phase in each nanoparticle. The CFO region, being the harder magnetic phase, is the most probable nucleation region which sparks the magnetization reversal process. According to this model, the nucleation process is initiated from the surface of the CFO@FO or the core of the FO@CFO. The use of, at least, three macrospins per region allows the model to implicitly incorporate the incoherent states on the interface or surface.

Figure 7 shows the calculated hysteresis loops from the current macrospin model. The agreement with experimental data [12] is remarkably good, especially in the low-temperature regime. The small value used for J_{inter} indicates that even with a dense ensemble of particles, the magnetic behavior is dominated by the intraparticle characteristics. For low temperatures, both samples are characterized by a *knee* behavior appearing right after the remanent state. Even though we have assumed a nonperfect interface, this behavior is not so pronounced for the single nanoparticles. Thus, for the case where the nanoparticles are grouped forming an assembly, it is possible to attribute a random anisotropy axis distribution creating now a range of energy barriers to be bypassed in the cycle to complete the magnetization reversal. The introduction of dipolar interactions has an effect that the coercive field drops down to values of about 1.1–1.3 T. This value is clearly lower than the one calculated for single nanoparticles. Even though the assembly is dense, dipolar interactions do not dramatically decrease the coercive field due to the moderate magnetic moment of the nanoparticles. It has to be noted here that even though the assembly is quite dense, we managed to reproduce the experimental data by

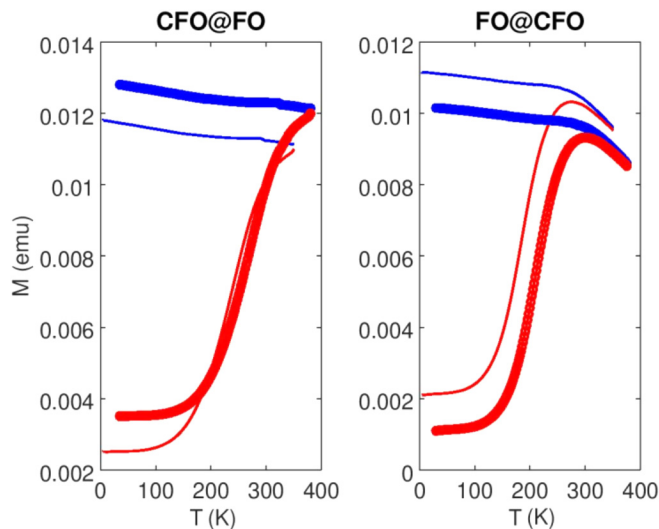


FIG. 8. Zero-field-cooling (red) and field-cooling (blue) curves for the assembly nanoparticles CFO@FO (left panel) and FO@CFO (right panel). The predictions of the theoretical model (circle symbol) are compared with the experimental measurements taken from Ref. [12] (solid line).

using a macrospin model. This fact means that we do not need to take into account the distribution of the dipolar fields because the intraparticle interactions are quite strong and, as already explained above, there cannot be any kind of magnetic domain formation in the nanoparticles. The magnetization reversal process depends strongly on the incoherent modes on the interface and surface arising from the exchange strength variations.

The accuracy of the current model decreases as the temperature of the system is increased (cf. Fig. 7). For this reason, we also simulate the the zero-field-cooling (ZFC) and field-cooling (FC) curves of the assemblies as shown in Fig. 8. Notably the profile of the ZFC and FC curves is reproduced quite well with the current macrospin model; however, in both cases, the blocking temperature T_B is overestimated. The latter effect is more pronounced in the FO@CFO system where the T_B is overestimated by 30 K. This overestimation is also found in the loop simulations as the coercive field is overestimated in all cases for temperatures larger than 5 K. The latter is a clear indication that there is a temperature dependence of the magnetic parameters, disregarded in the current model.

III. SUMMARY AND CONCLUSIONS

In conclusion, using progressively more complex models beginning with the case of isolated single nanoparticles, we have investigated the magnetic properties of ferrite nanoparticles. The proposed macrospin model is able to describe substantially well the experimental measurements of an assembly of such core-shell nanoparticle systems. By taking the bulk values of the exchange interactions and magnetocrystalline anisotropy, we discussed the calculated hysteresis

loops in terms of the ratio between the surface anisotropy with respect to the core anisotropy for CFO and FO nanoparticles [cf. Fig. 1(a)]. By gaining some information about the internal parameters of isolated nanoparticles, we improved the model by considering regions with different magnetic texture, so that the particles now have a core, interface, shell, and surface [cf. Fig. 1(b)]. This improvement requires consideration of more types of exchange coupling between the different regions as well as magnetocrystalline anisotropies per region. By scaling exchange interactions and anisotropies in the interface and surface, we can get information about the details of the hysteresis loops so that we have full control over features seen in the experimental hysteresis loops, such as, the *knee* present in the vicinity of the remanent field that is measured in experiments for an assembly of nanoparticles (cf. Fig. 7). In the last stage of the macromagnetic model, we brought the core-shell nanoparticles, with their internal structure, all together forming a cubic crystal structure [see Fig. 1(c)]. This system is describes by the Hamiltonian of Eq. (3). In doing so, the model is capable of describing with high fidelity the experimental hysteresis loops and ZFC and FC curves. Overall, experimental and theoretical results are in close agreement although discrepancies in the hysteresis loops increase at higher temperatures. It is well known in literature that the Heisenberg exchange interaction is a function of the temperature [23]. We speculate here that the small deviation of the calculated hysteresis loops with respect to the experimental ones at 100 K is due to the fact we do not include a temperature dependence in the estimated Heisenberg exchange interactions.

Overall, and based on the good description of the experimental results, the current model underpins the proposed internal structure of the nanoparticles, not only with the core and shell, but also with two thin layers of interface and surface, so that the interface plays an important role in describing the observed *knee* in the experimental hysteresis loops.

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Correction: One of the original authors (Nikolaos Ntallis) requested that his name be removed, which has been implemented.