

## PAPER

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# Assembly of nanocube super-structures directed by surface and magnetic interactions†

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We study the stabilisation of clusters and lattices of cuboidal particles with long-ranged magnetic dipolar and short-ranged surface interactions. Two realistic systems were considered: one with magnetisation oriented in the [001] crystallographic direction and the other with magnetisation along the [111] direction. We have studied magnetic nanocube clusters first in the limit of  $T = 0$  K intending to elucidate the structural genesis of low energy configurations and then analysed finite-temperature behaviour of the same systems in simulations. Our results demonstrate that dipolar coupling can stabilise nanoparticle assemblies with cubic, planar, and linear arrangements seen previously in experiments. While attractive surface energy supports the formation of super-cubes, repulsion results in the elongated structures in the form of rods and chains. We observe the stabilisation of the ferromagnetic planar arrangements of the cubes standing on their corners and in contact over edges. We illustrate that minimal energy structures depend only on the size of the assembly and balance of surface repulsion and magnetic dipolar coupling. The presented results are scalable to different particle sizes and material parameters.

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## 1 Introduction

Assembly of nanoparticles into target functional structures refers to the spontaneous formation of ordered patterns from disordered constituents. The self and directed assembly of magnetic particles carrying permanent dipolar moment is of great interest for many technical applications. In some cases, complex superstructures are created in a sequence of steps in which first particles are formed, and the interactions between nanoparticles are carefully tuned to steer the whole self-assembly process to ultimately form a macroscale ordered structure.<sup>1–4</sup> The external field can drive assembly to various shapes using coils, conductive wires or meso- to microscale two-dimensional (2D) magnetised shapes with nanoparticles as building blocks.<sup>5–9</sup> Applications rely on outstanding assembly properties of magnetic nanoparticles, and therefore, the understanding of relevant energetic scales is crucial for designing processes including magnetorheological fluids,<sup>10</sup> high-density magnetic storage devices,<sup>11</sup> and tailored superlattices.<sup>12,13</sup> The magnetic sphere and corresponding dipolar hard-sphere model, with a point-dipole at the centre of

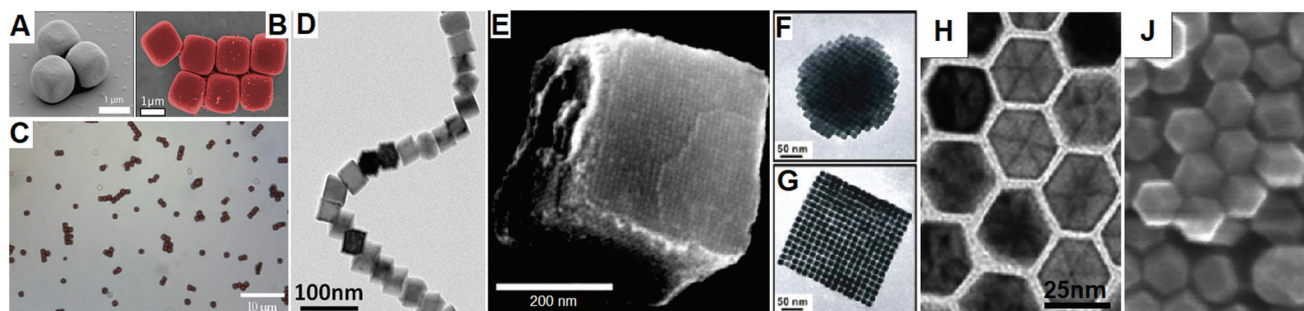
a spherically symmetric hardcore, is one the most studied systems both in the experiment and theoretically due to the simplicity of representation for particles with magnetic interactions.

In contrast, cuboid particle geometry has received less attention despite being advantageous for many applications in terms of photonic response,<sup>13,21</sup> improved catalytic activity,<sup>22</sup> packing density,<sup>23,24</sup> and orientability.<sup>5,18</sup> Still, the cubic shape is unique in two ways. First, this shape imposes strong coupling between geometry and magnetic interaction in assemblies of magnetic particles, where interparticle junctions formed by cube over their surfaces, corners, and edges are stabilised by strong attractive magnetic forces.<sup>25–28</sup> Second, it is a compelling geometry for obtaining non-close-packed assemblies by designing surface interaction through facets. The magnetic forces are not screened in solution and are virtually independent of changes in experimental conditions such as humidity, pH, or solvent composition, which can alter surface interactions, thus, giving us significant design freedom.<sup>14–16</sup> The surface interactions between nanoparticles can be van der Waals, electrostatic or covalent interactions depending on the composition of the solvent and adsorbed layer on particles. A class of surface-modifying compounds that control the association of nanoparticles is referred to here as ligands, but terms molecular linkers, surface modifiers and surfactants (*i.e.*, surface active agents) are used elsewhere in the literature.<sup>29–31</sup> It is worth noting that particles with significant shape anisotropy can remain a single domain at much larger sizes than their spherical counterparts.<sup>32</sup> From a fundamental point of

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**Fig. 1** SEM images of polymorphs composed of (A) silica-coated and (B) bare hematite microcuboids, adapted with permission from ref. 14 published by The Royal Society of Chemistry and ref. 15 copyright (2012) American Chemical Society, respectively. (C) Optical microscopy images of hematite cuboids during particle self-assembly induced by sedimentation, adapted with permission from ref. 16 copyright (2012) American Chemical Society. (D) The self-assembled chain in the gas phase of 25 nm iron/iron-oxide core/shell magnetic nanocubes, adapted with permission from ref. 17 published by The Royal Society of Chemistry. (E) SEM image of a 3D cuboid which consists of more than 10 000 iron-oxide nanocubes, adapted with permission from ref. 18 copyright (2015) National Academy of Sciences. TEM images of the self-organised (F) super-sphere along the [001] zone axis and (G) super-cube obtained by control of surface interactions, adapted with permission from ref. 19 copyright (2012) American Chemical Society. (H) Magnified TEM image and (J) STEM images of the 2D nickel nanocube lattice (cubes are suspended on corners) both adapted with permission from ref. 20 with permission from The Royal Society of Chemistry.

view, by looking into a self-assembled structure we can in reverse conclude about interactions present in the system. There is an important reason to investigate monodispersed magnetic cubes: atomically flat sides of nanocubes allow them to glide almost without friction over their superstructures.<sup>17</sup> Besides, square symmetry reduces the number of local energetic minima in which the system can be quenched, preventing the creation of the clumps,<sup>18</sup> while tailoring the magnetic properties of the nanoparticles can provide an effective approach to direct the self-assembly process.<sup>15,33</sup> Here, we analyse magnetic nanocubes in which the interaction landscape is defined by the steric effect, and magnetic and surface interactions.<sup>16,17,24,34,35</sup>

Fig. 1 summarises the magnetic nanocuboid structure stabilised by an interplay of density, magnetic anisotropy, the strength of dipolar coupling, and surface interactions. If the density of particles is low, small clusters might be created.<sup>15</sup> The hematite micron-sized cuboids demonstrate how dipolar interactions and particle shape result in the creation of the regular polymorphs, *cf.*, Fig. 1A–C. Designing a rational assembly mechanism based on magnetostatic interactions requires understanding differences between the energies of different structures. Strong and long-ranged dipolar coupling leads to the formation of macroscopic chains even in the gas phase, from particles coming from the cluster source, as demonstrated in Fig. 1D from ref. 17. The tendency for hydrophobic particles to cluster in water is readily used to self-assemble super-particles with a remarkable internal order, *e.g.*, regular super-cubes composed of up to 10 000 nanocubes in Fig. 1E from ref. 18. The shape of assemblies can be tuned between super-spheres and super-cubes, *cf.* Fig. 1F and G from ref. 19. Chemistry of solution in which particles are created, *i.e.*, presence of chloride ions and fatty acids, which control growth and prevent agglomeration also results in strong repulsion of the particles. Fig. 1H and J adapted from ref. 20 show two-dimensional crystals formed by cubic-shaped particles stand-

ing on their corners, which is the result of the interplay of repulsion and magnetic interaction between particles.

In the present contribution, we consider assemblies of cubic magnetic particles and analyse the structural changes of the minimal energy configuration. Designing a rational assembly mechanism based on magnetostatic interactions requires understanding differences between the energies of different structures. We systematically investigate clusters and lattices stabilised by magnetic dipolar coupling of their nanocube constituents. We compared the magnetic binding energy to the contact surface and calculated the magnitude of repulsive or attractive surface interaction needed to switch between different structures.

## 2 Methods and models

We study a structure of the colloidal agglomerate formed from nano-particles described by Hamiltonian:  $H = U + \epsilon_{ss}S^{\text{int}} + \gamma S^{\text{eff}} + k_B T$ , where  $U$  is the dipolar magnetic interaction energy and  $S^{\text{int}}$  and  $\epsilon_{ss}S^{\text{int}}$  are the interparticle surface contact area and surface binding energy, respectively. The effective surface area  $S^{\text{eff}}$ , surface tension  $\gamma$  of the suspension liquid, and temperature  $T$  are parameters which describe interaction with the suspension.

### 2.1 Dipolar magnetic interaction

Magnetic cuboids are synthesised from iron and its oxides, as well as, from non-ferrous materials with different magnetic anisotropy and remanent magnetisation. An overview of sizes, saturation magnetisation, and easy magnetisation axis found in the literature<sup>11,15,16,20,24,33,36–41</sup> is given in Table 1. Magnetite ( $\text{Fe}_3\text{O}_4$ ),<sup>42</sup> nickel platinum alloy<sup>20</sup> nanocubes magnetic easy axis lying along the [111] crystallographic direction. This is in contrast to cubes of iron,<sup>42</sup> FePt,<sup>40</sup> and cobalt/zinc ferrite<sup>33,36</sup> that have cubic magnetic anisotropy and therefore

**Table 1** Mean size, saturation magnetisation ( $M_s$ ), and easy magnetisation axis for different materials found in the literature

Nanocube	Size [nm]	$M_s$ [kA m <sup>-1</sup> ]	Easy axis	Ref.
FePt	12	50	[001]	Chou <i>et al.</i> <sup>41</sup>
CoFe <sub>2</sub> O <sub>4</sub>	8	400	[001]	Song and Zhang <sup>36</sup>
	20	200		Wu <i>et al.</i> <sup>11</sup>
Zn <sub>0.4</sub> Fe <sub>2.6</sub> O <sub>4</sub>	20	874	[001]	Noh <i>et al.</i> <sup>33</sup>
	60	1060		
Fe	18	1700	[001]	Kronast <i>et al.</i> <sup>38</sup>
NiPt	25	600	[111]	Cuya Huaman <i>et al.</i> <sup>20</sup>
Fe <sub>3</sub> O <sub>4</sub>	9	100	[111]	Moya <i>et al.</i> <sup>43</sup>
Magnetite	14	130		
	30	160		Niculaes <i>et al.</i> <sup>31</sup>
	1000	480		Aoshima <i>et al.</i> <sup>16</sup>
γFe <sub>2</sub> O <sub>3</sub> , maghemite	9	32	[111]	Ahniyaz <i>et al.</i> <sup>24</sup>
αFe <sub>2</sub> O <sub>3</sub> , hematite	1000	2.2	[111]	Sacanna <i>et al.</i> <sup>15</sup>

preference for magnetisation along the [001] direction. An additional variability of the properties may be achieved with a core-shell structure, which can combine high remanent magnetisation of the core with magnetic anisotropy defined by the shell.<sup>42</sup> The iron-oxide nanocuboids (*i.e.*, hematite, and magnetite) can be synthesised as micron-sized colloids. Hematite colloids, in particular, maintain a permanent dipole moment even at a large particle size.

Small single-domain magnets are treated like uniaxial magnets. We consider the two most common magnetisation directions: alongside [001] or along the principal diagonal [111] of the cube. Magnetic nanoparticles can have complex coupling involving both dipolar and exchange interactions. Their interaction is described through dipole-dipole interaction potential: it is assumed that each particle carries identical dipolar (magnetic) moment with magnitude  $m_0 = M_s d^3$ . The saturation magnetisation is material and particle size-dependent and can take value from modest 50 kA m<sup>-1</sup> in 12 nm FePt<sup>41</sup> to 874 kA m<sup>-1</sup> for 20 nm Zn<sub>0.4</sub>Fe<sub>2.6</sub>O<sub>4</sub> nanocubes.<sup>33</sup> We can approximate the reference magnetic energy of interaction of two touching nanocubes with  $v = \mu_0 m_0^2 / 4\pi d^3$ . For dependence on saturation magnetization  $M_s$  and  $d$  particle size, we obtain  $v \propto M_s^2 d^3$ . As a result, a choice of material or dimension of cubes has a strong influence on the magnetic interactions.

In the case of a pure 40 nm single-crystal magnetite cube and  $M_s = 160$  kA m<sup>-1</sup>, *cf.* ref. 31, the reference magnetic interaction energy was estimated to be  $v = 1$  eV, *i.e.*,  $40k_B T$ , where  $T = 300$  K is the temperature and  $k_B$  is Boltzmann's constant. We chose the cube's dimensions to facilitate comparison both with real units used in experiment and scales used in generic theoretical considerations. The magnetic field generated by one particle at the centre of mass of the other particle (placed side by side) is  $B_0 \approx \mu_0 m_0 / (2\pi d^3) = 16$  mT.

The dipolar magnetic interactions between an assembly of magnetic cubes are treated semi-analytically for small clusters  $N \leq 8$  or using 9-dipole approximation<sup>17</sup> (see the ESI†). This model represents an extension of the previously used single central dipole models.<sup>25,26</sup> In our model, the additional

dipoles are placed in the corners of the cube and account for the interaction of the touching corners and edges of the cubes. The minimisation of energy was performed systematically for  $N \leq 16$  for all possible geometric and magnetic configurations. For larger systems, the genetic algorithm was used to minimise the magnetic configuration (*i.e.*,  $N > 16$ ). We should note that in our calculations, we did not allow for the relaxation of magnetic moments around the easy-magnetisation axis. Such relaxation will be particularly pronounced in [111]-magnetic configurations where magnetisation has very localised flux closure, *cf.* ref. 18 and 44.

## 2.2 Surface interaction

The nanocube assemblies show a clearly defined contact surface area. These surfaces can be engineered repulsive or attractive, either by adsorbed layers from solution<sup>34,35</sup> or by polymers grafted on it.<sup>21,44,45</sup> The stacking of the cubes tends to reduce or increase the surface area depending on the nature of surface interaction. In our calculations, surface energy is proportional to the contact surface. We will first discuss strong van der Waals attraction of the clean surfaces. Then we will explain how the surfaces can be modified to obtain weak attractive or even repulsive forces, and show that the resulting energy scales are similar to that of magnetic interaction.

Clean metallic or metal-oxide nanocubes interact with each other through van der Waals interactions characterised by the interaction energy and distance. The interaction energy parameter can be calculated as,<sup>46</sup>  $\epsilon_{ss} = -A_{\text{mm}}\sigma_{\text{mm}}^4\rho^2/4\pi^2$  where  $\sigma_{\text{mm}} = 0.35$  nm is the size parameter for iron atoms,  $\rho = 85$  nm<sup>-3</sup> the density of iron atoms in the bcc lattice, and  $A_{\text{mm}} = 2.38$  eV is the average Hamaker constant for metals.<sup>47</sup> We obtain a value of  $\epsilon_{ss} = -6$  eV nm<sup>-2</sup>, which results in a surface binding energy of  $e_{ss} = \epsilon_{ss}d^2 = 9.6$  keV over a  $40 \times 40$  nm surface (fully touching cubes) and is comparable to the values found elsewhere.<sup>21,45</sup> We assume that the resulting interaction is proportional to the contact surface and dependent on the orientation of the touching cubes.‡

Since van der Waals interaction is strong, the so-called steric stabilisation is used to control the coalescence of the particles typically by a thin adsorbed or grafted layer of appropriate thickness. These thin layers are used to obtain weak attraction, comparable to magnetic interaction energy between particles, and even repulsion, which can accommodate the formation of non-close-packed agglomerates. Engineering the repulsion and distance between magnetic particles is a typical way to steer the extent of the cube's aggregation.<sup>17,20</sup> The repulsive forces can arise from neutral steric layers (*i.e.*, entropic repulsion of grafted polymer chains) or electric double layers. The excluded volume of steric layers covering two particles results in a repulsive force. Each molecule of steric layer occupies a certain amount of space and, if molecules are brought close together, there is an associated cost in energy.

‡ Ref. 45 showed that, when cubes get close, dependence on the relative orientation intensifies and interacting regions are sharply localised in the vicinity of the surface.

The thickness of layers and the local density of grafted/attached polymers determine the extent and strength of repulsion, respectively. The maximal energy of the repulsion is of the order of  $\epsilon_{ss} = 3 \text{ meV nm}^{-2}$ , *i.e.*,  $e_s = 4.8 \text{ eV}$  for 40 nm particles, *cf.* ref. 21 and 44. We should also note that while the interaction between surfaces is repulsive, the grafted-polymer chains can accommodate edge contact. Gao *et al.*<sup>21</sup> found weak and extremely short-ranged attractions between edges, which we did not include in our model. These edge–edge and edge–surface interactions will certainly further stabilise open structures analysed in the present work. We limited our considerations to a generic model for surface interactions which does not include any specific characteristics of many possible surface modifications.<sup>21,29–31</sup>

At this point, we would like to discuss how the size of the particles influences the balance between surface and magnetic energy. Several studies explored the assembly of the small nanocubes, *i.e.*,  $d \leq 25 \text{ nm}$ , *cf.* ref. 5 and 17. We recall that magnetic dipole interactions are roughly proportional to volume, *i.e.*,  $d^3$  and the surface interactions are proportional to  $d^2$ . In consequence, surface interactions would become more pronounced than magnetic interactions with decreasing particle size. Besides, for nanoparticles covered by a layer of organic ligands, the finite length of the ligand molecules becomes more critical in the assembly process while decreasing the particle size to 20 nm and below. The interaction is repulsive with a distance of about 2–5 nm for the grafting density of 0.04 chains per  $\text{nm}^2$ .<sup>44</sup> The effects of the finite-range of surface repulsion are discussed in sec. 3.5.

### 2.3 Interactions of assembly with the suspension

The interaction of hydrophobic particles with the suspension can itself alone drive self-assembly. Due to surface tension, a liquid tries to reduce the surface area at the interface. This also applies to the interaction of the suspension with the nano-agglomerate through their interface. The agglomeration process reduces the interface surface between nanoparticles and suspension, synchronously reducing interparticle energy and surface energy of the liquid–nanoparticle interface. Water, the dominant chemical component of most suspensions, has particularly high surface tension. The Lum–Chandler–Weeks<sup>48,49</sup> (LCW) theory explains the mechanism of how the interface surface area is reduced. Due to the thermal energy of molecules, according to LCW theory under ambient conditions (room temperature and 1 atm pressure), liquid and vapour phases of water are close to phase coexistence. Therefore LCW theory bridges macroscopic wetting phenomena characterised by surface energy  $\gamma S^{\text{eff}}$  and nanoscale structuring of the suspension–nanoparticle interface, which gives rise to effective surface area  $S^{\text{eff}}$ . The effective surface area  $S_{\text{eff}}$  is smaller than the total surface  $S$  of the agglomerate. The factor of proportionality  $\gamma$  is a solvent dependent parameter called surface tension. The direction in which self-assembly is going to drive the system is therefore also defined by the effective surface area and surface tension. We should note that while the interaction between surfaces of individual particles (introduced in

the previous section) is anisotropic and can be both attractive and repulsive, the interaction with the solvent takes the form of isotropic external pressure.

### 2.4 Finite temperature simulations

Molecular dynamics simulations in the LAMMPS simulation package were used to test the thermodynamic stability of investigated magnetic structures. We have performed three-dimensional simulations using a Langevin thermostat to keep constant temperature conditions and include the effect of a fluid environment. The Langevin thermostat accounts both for viscous drag and for the random Brownian force on suspended particles exerted by the surrounding fluid.<sup>§</sup>

The cubes are represented by two types of contact potential: (i) purely repulsive Weeks–Chandler–Anderson (WCA) potential, so called, contact potential<sup>28</sup> and (ii) repulsive or attractive potential in Yukawa form (see the ESI†). The total force of contact due to the WCA potential is calculated using 33 spheres (overlapping): a large central sphere with diameter  $d$  and 32 smaller with diameter  $(\sqrt{3} - 1)d/(\sqrt{3} + 1)$  places in cube's corners and edges. This geometry allows smooth gliding of one cube over the other. The previous form of surface interactions, solely dependent on the contact surface, is very convenient for analytical calculations but not straightforward to implement in molecular dynamics. Instead, we implement an additional interaction potential in Yukawa form between nine-point dipoles accounting for the short-range repulsion or attraction. This model was the basis for finite-temperature molecular dynamics simulation. The total force was the conservative force of inter-particle interactions. The magnetic interaction was treated with an interaction cut-off at  $r_{\text{cut}}/d = 8$ , in order to reduce computational load without compromising precision *cf.* ref. 27. We chose not to use the computationally expensive Ewald summation method, as our study is focused on the stability of assembled objects. The rotational degrees of freedom are also governed by the equations of motion for torque and angular velocity of the spheres. The total force and torque on each cube are computed as the sum of the forces and torques on its constituent particles at each timestep. The dipole orientation is accordingly rotated with the cube as a single entity. The rotation was implemented by creating internal data structures for each rigid body and performing time integration on these data structures.<sup>50,51</sup>

§ We have based our model in the low-density limit, *i.e.*,  $4\pi k_B T / \mu_0 M_0^2 \gg N/V$  where  $N$  is the number of suspended particles in a volume  $V$ . A higher density of nanocubes will have a profound influence on the assembly. The long-ranged dipolar interaction can result in self-organized assemblies interacting with each other. There are two strategies to obtain assembly control: work with low concentration or reduce the volume in which particles are suspended in the moment of the assembly. The assembly at lower concentrations has a disadvantage that it will increase the assembly time since it would be governed by diffusion. The self-assembly in a reduced volume could be achieved by creating a flow of magnetic particles through a narrow tube or slit, either in liquid micro-reactor or a cluster gun, respectively. This will result in the creation of linear assemblies.<sup>17</sup> Another way to reduce volume is the assembly performed at the liquid–gas or solid–liquid 2D interface.<sup>20</sup>

The magnetic energy varies strongly with the system size, while for the 40 nm magnetite cube the reference magnetic energy is  $\nu = 1$  eV ( $M_s = 160$  kA m<sup>-1</sup>, see sec. 2.1), and for the 10 nm magnetic cube it is only  $\nu = 16$  meV. For this reason, we will make our discussion in this section independent of the system by introducing reference temperature  $T_{\text{ref}} = \nu/k_B$ . The reference temperatures are 12 000 K and 1500 K, for 40 nm and 20 nm cubes, respectively. It is worth noting that the increase of temperature also may reduce saturation magnetisation  $M_s$  which was not taken into account. The mass of the cuboid corresponded to the 40 nm magnetite 40 cube and was distributed over nine constitutive dipolar particles. The molecular dynamics step was  $t = 20$  ms and the typical length of the molecular dynamics simulation was 1000 s.

### 3 Results

The energy scales of assemblies can be probed in detail by analytical calculations of ideal configurations. We show the system size and surface interaction dependent behaviour of different configurations for [111] and [001] magnetisations. Finally, we describe the behaviour of these systems when the surface tension effect and the dynamics in the solvent are taken into account.

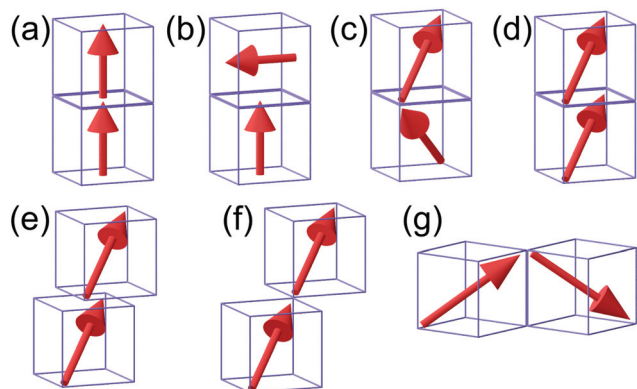
#### 3.1 Energy of dimers

It is instructive to first consider the interaction between two cubes with completely touching faces and compare it with the two elementary dipole situation. A ground configuration of the system is head-tail with magnetic energy  $u_{\text{min}}^{[001]} = -0.815$  eV, see Fig. 2(a). Opposite to the head-tail configuration would be the head-on-head configuration with the positive energy value  $u^{[001]} = 0.815$  eV indicating that there is a strong energy penalty upon assembling a magnetic dimer in that configuration from infinite relative separation. Due to symmetry, the magnetic T-configuration in Fig. 2(b) has zero energy. This feature is fully

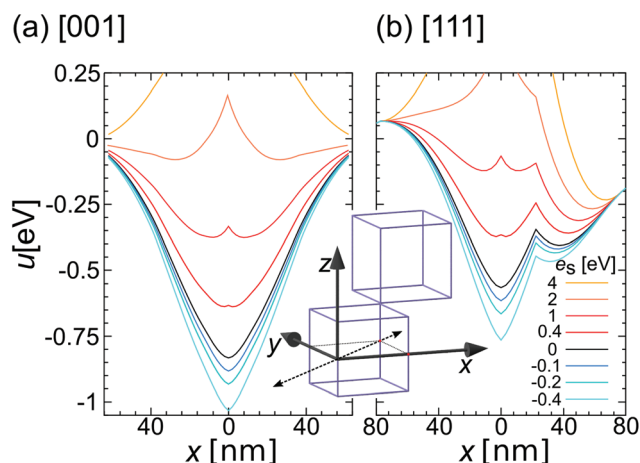
consistent with two spherical magnetic beads where magnetic T-configuration also has zero energy. The magnetic energy for the magnetic cube magnetised along the principal diagonal is  $u_{zz}^{[111]} = 2u^{[001]}/3 = -0.555$  eV for the zig-zag magnetic configuration and zero for the parallel magnetic configuration. Both configurations are shown in Fig. 2(c) and (d), respectively.

For a dimer of nanocubes, the assembly mechanism drives the particles to adopt structures that create a head-tail configuration, very much like chains of magnetic beads. In the case of the [001] direction, the head-tail configuration represents a deep central minimum of potential energy, *cf.*, Fig. 3(a), restricting the lateral movement of the magnetic particles, and consequently leading to a quite stiff configuration. In contrast, when the magnetisation is along the principal axis, *i.e.*, [111] direction, the structure is more flexible since magnetisation is pointing to/away of cube's corners. The resulting minimal magnetic energy profile of the [111] magnetic cube dimer has two minima, *i.e.*, local and global see *cf.*, Fig. 3(b). The configuration with minimal energy has a zig-zag dipole vector placement, *i.e.*, Fig. 2(c). At the minimum energy point (zig-zag configuration), the distance between their centres  $\Delta r_2$  is equal to the cube size  $\Delta r_2 = d = 40$  nm and particles are fully in contact, *cf.*, Fig. 2(c). The system can extend to a full head-tail configuration in Fig. 2(e) by synchronous displacement and rotation of magnetic a cube between two minima.<sup>17</sup> Balcells *et al.*<sup>17</sup> showed that relative displacement and rotation can take place along the bottom of the circular valley connecting two minima characterised by gradual energy increase.

If we include surface energy, the total energy is a result of the net magnetic orientations and the contact surface. Now we



**Fig. 2** Different configurations of two uniformly [001] and [111] magnetised cubes. For [001] magnetisation, so called, (a) head-tail and (b) T-configuration are shown. In the case of [111] magnetisation, so called, (c) zig-zag, (d) parallel, (e) head-tail, (f) point and (g) edge configurations are shown.



**Fig. 3** The minimal energy per particle  $u$  for a cube moving along the face diagonal of the other one. We obtained that two cubes are always parallel and only magnetisation changes. The horizontal axis shows a projection of the centre of mass on the  $x$ -axis, total displacement is  $\sqrt{2}x$ . The magnetisation is oriented in the (a) [001] and (b) [111] direction. The uniformly magnetised cubes with  $d = 40$  nm side are considered with  $M_s = 160$  kA m<sup>-1</sup> magnetisation. The energies are given in electronvolts, *i.e.*, the reference magnetic energy is  $\nu = 1$  eV. The surface coupling energy of two cubes in full contact  $\epsilon_s = \epsilon_{ss}d^2$  is varied. The results are shown without  $\epsilon_s = 0$ , as well as for attractive  $\epsilon_s = -0.1, -0.2, -0.4$  eV and repulsive  $\epsilon_s = 0.4, 1, 2, 4$  eV surface couplings.

analyse the evolution of the energy profile along the cube's face diagonal connecting two minima. The results are shown for different, so-called, surface coupling energies of two cubes in full contact  $e_s = \epsilon_{ss}d^2$ . We use surface coupling energy rather than energy per surface area to facilitate comparison with magnetic energy. If the particles attract each other, *i.e.*, for  $e_s < 0$  promotes fully touching configuration of the cubes (maximal contact surface). Therefore, the attractive surface interaction leads to a deeper central minimum of the potential energy, *cf.* curves for  $e_s < 0$  in Fig. 3, adding stability to ground state configuration, and consequently to increased stiffness of the configuration to any kind of deformation.

If the surface interaction is repulsive, *i.e.*, for positive  $e_s > 0$ , the energy minimum becomes shallower. In the repulsive regime, two magnetic configurations [001] and [111] start to behave strikingly differently. For  $e_s > 0$ , the central minimum of [001] disappears and evolves into a potential valley with local conical energy maximum in the middle, see Fig. 3(a). With increasing repulsion, the maximum increases, and the stable configuration moves towards the edge of the [001] magnetic nanocube and becomes fully unstable for  $e_s \gtrsim 2$  eV, *i.e.*, particles will not stay in close contact.

Evolution of the structure of the [111] magnetised dimer in the repulsive surface energy regime (*i.e.*,  $e_s > 0$ ) is complex. Fig. 3(b) shows the evolution of the energy profile with surface coupling energy for cubes with [111] magnetisation. The *ht* configuration in Fig. 2(c) corresponds to the second minimum of the magnetic energy at point  $\Delta r = 0.5d = 20$  nm in Fig. 3(b). The centre of mass of the top particle is above the corner of the bottom particle in this configuration. At the second minimum, the centres of mass of the particles are 22% further apart than at the global minimum (as shown in Fig. 3,  $\Delta r_2/d = \sqrt{3}/2$ , *i.e.*,  $\Delta r_2 \approx 49$  nm for 40 nm particles). The magnetic head–tail configuration of dipoles has magnetic energy  $u_{\text{ht}}^{[111]} = -0.81$  eV, which is 27% energy increase compared to the global minimum. The critical surface repulsion energy is equal to the difference of magnetic energies of two minima divided by the relative contact surface difference of the two configurations  $\epsilon_s^{\text{cirt}} = 2(u_{\text{ht}}^{[111]} - u_{\text{zz}}^{[111]})/0.75 \approx 0.4$  eV. Below  $e_s = 0.4$  eV particles will tend to stay in the zig-zag magnetic configuration, and above they will open up to the head–tail configuration. The [111] magnetic particles will stay in contact even for very large repulsion energies, *e.g.*, see the  $e_s = 4$  eV curve in Fig. 2(b). Finally, we want to find out which is the lowest magnetic energy configuration of the two [111] magnetised cube system if there is no contact surface. Fig. 2(f) and (g) show two [111] magnetised cubes touching only in a point or over an edge. The fully extended head–tail magnetic configuration in Fig. 2(f) has  $-0.125$  eV magnetic binding energy. The cubes touching over the edge have a zig-zag magnetic configuration and a slightly lower binding energy  $-0.14$  eV, *cf.* Fig. 2(f).

## 3.2 Magnetisation [111]

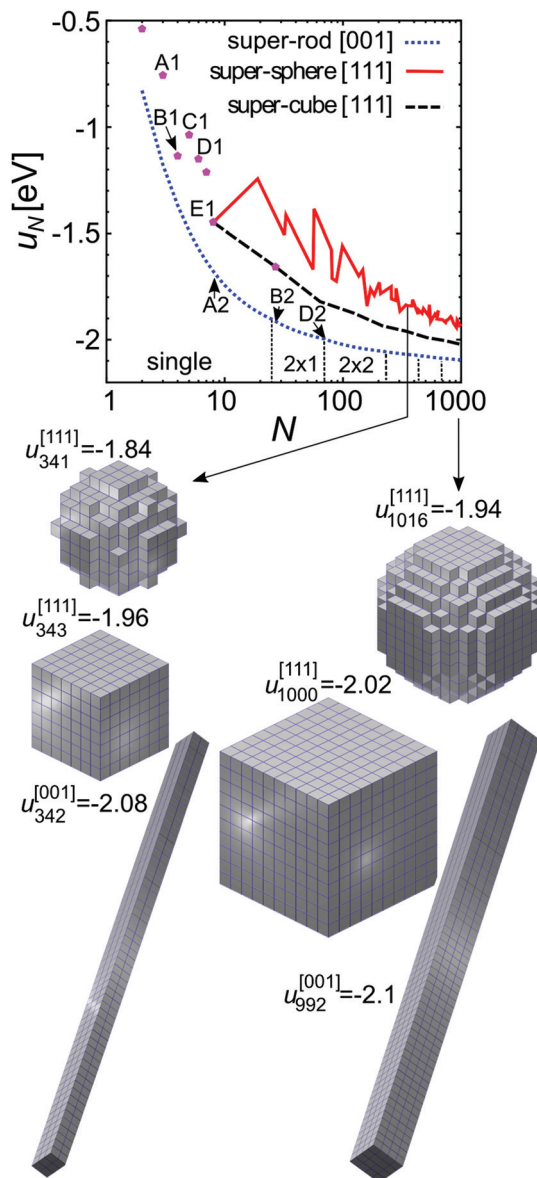
**3.2.1 From polymorphs to super-cubes.** We have investigated ground state configurations of nanocube assemblies  $2 \leq$

$N \leq 8$  by calculating energies of all possible magnetic and geometrical arrangements. The diagonal polarisation of [111] magnetised cubes results in a strong tendency to create closed flux structures. The two-dimensional polymorphs were ground states only for  $N = 3, 4$ , *cf.* Fig. 5(A1) and (B1). For  $N \geq 5$ , three-dimensional polymorphs become a ground state. For  $N = 5$ , see Fig. 5(C1), the system has an uncompensated magnetic moment. Interestingly, the formation of five particle polymorph leads to penalty (increase) in magnetic binding energy, *i.e.*, binding energy per particle increases from  $u_4 = -1.16$  eV to  $u_5 = -1.06$  eV. Also we should note that there is less than 1% binding energy difference for  $N = 5$  and 6 polymorphs between 3D (*e.g.*, ground state) and 2D (non-ground state isomer) structures, *e.g.*,  $u_5 = -1.06$  eV for the cube on top of the  $2 \times 2$  square and  $u_5 = -1.05$  eV on the side, see in Fig. 5 (C1). Further closure of head–tail magnetic circulation of all magnetic cubes, *i.e.*, for  $N = 8$ , leads to a 10% difference in magnetic binding energy between 2D and 3D structures. More specifically, for polymorphs, a well-known arrangement of the dipoles in head–tail circulation is found (see Fig. 5). Direct computation of energies for all possible configurations increases exponentially with the number of cubes so, beyond eight nanocubes this approach is not feasible. We used the genetic algorithm<sup>52</sup> to obtain the minimal binding energy of a super-cube composed of  $3 \times 3 \times 3$  nanocubes, see the ESI† All three dipole vector components along sides of the cubes are inscribed antiferromagnetically (*cf.*,  $N = 8$  in Fig. 5), resulting in a vortex magnetic structure. For a super-cube composed of  $3 \times 3 \times 3$  nanocubes, *e.g.*,  $N = 27$ , the minimal binding energy was obtained by the genetic algorithm<sup>52</sup> (see the ESI†). All three dipole vector components along sides of the cubes are inscribed antiferromagnetically (*cf.*,  $N = 8$  in Fig. 5), resulting in a vortex magnetic structure.

**3.2.2 Interparticle interactions: super-cube vs. super-sphere.** In Fig. 4, we have numerically compared the magnetic binding energy  $u_N$  (per particle) of super-spheres and super-cubes. To calculate magnetic energy, the super-cubes and spheres were inscribed antiferromagnetically with [111] magnetisation. The energy evolution with the number of nanocubes is displayed in Fig. 4. We demonstrate that, with respect to magnetic binding, the super-sphere is an unfavourable configuration. The energy of a super-sphere is always above the energy of a super-cube (except in the case of the smallest sphere, *i.e.*,  $N = 8$ , which is also a cube).

First, we discuss the situation when the surface coupling is attractive and much stronger than dipolar magnetic interactions between nanocubes. This is a limiting case where the system behaviour is independent of magnetic anisotropy (in our case, [111] or [001]). When surface coupling is attractive, *i.e.*,  $e_s < 0$ , the assemblies tend to decrease the total (free) surface area. One can construct, so-called, super-sphere in which magnets are centred around the middle of the super-sphere within a radius  $R$  (*cf.* Fig. 4).

The perfect super-sphere formed from nanocubes has a surface consisting of kinks and steps. As a result, the surface area of the super-sphere is larger than that of a super-cube.



**Fig. 4** Magnetic binding energy per particle ( $u_N$ ) as a function of number of cubes ( $N$ ) in polymorphs (dots), super-cubes (dashed), and super-spheres (full line) for magnetised cubes along the main diagonal ([111] direction) and minimal energy super-rods with [001] magnetised cubes. Regular isomers of super-structures are shown for  $N \approx 343$  and 1000 constituent nanocubes. The uniformly magnetised cubes with  $d = 40$  nm side are considered to have  $M_s = 160$  kA m $^{-1}$  magnetisation. The energies are given in electron-volts, *i.e.*, the reference energy is  $\nu = 1$  eV.

The super-sphere surface ( $S_{ss}$ ) to volume ( $V_{ss}$ ) ratio is  $S_{ss}/V_{ss} \approx 7.4N^{-1/3}$ , for  $N \gg 1$  and therefore about 23% larger than that of the super-cube,  $6N^{-1/3}$  made of an identical number of nanocubes. This means that the creation of a super-cube (rather than a super-sphere) is a path to reduce the free surface in a system composed of nanocubes. From scaling laws in Table 2 the difference between the super-particles decreases with  $N^{-1/3}$ . Still, since the super-sphere has a larger exterior surface and hence a smaller contact surface than its cubic counterpart, the surface repulsion needed to induce

**Table 2** Scaling laws for magnetic energy per particle  $u(N)$  and surface area  $S(N)$  for different structures with the number of constitutive cubes ( $N$ ). The results are shown for two easy magnetisation axes [111] and [001] in different structures such as; super-cube, super-sphere, super-rod (all three shown in Fig. 4), corner-cube planar structures [111] (Fig. 6), linear zig-zag [111] (right side of Fig. 5), head-tail [001] chains of fully touching cubes (e.g., in Fig. 8), and head-tail [111] chains of partially touching (over 1/4 of the side surface) cubes. The expressions for energies and surface areas of the super-sphere and super-rod are obtained numerically from calculated data. The energies are given in electron-volts for uniformly magnetised cubes with  $d = 40$  nm side and saturation magnetisation  $M_s = 160$  kA m $^{-1}$ , *i.e.*, the reference energy is  $\nu = 1$  eV

Super structure	Axis	$u_N$ [eV]	$S_N d^2$
Super-cube	[111]	$-2.15 + 1.307N^{-1/3}$	$6N^{2/3}$
	[001]	$-2.15 + 1.321N^{-1/3}$	
Super-sphere	[111]	$-2.15 + 2.23N^{-1/3}$	$\approx 7.4N^{2/3}$
	[001]	$-2.15 + 2.3N^{-1/3}$	
Super-rod	[001]	$-2.15 + 0.56N^{-1/3}$	$\approx 10.24N^{2/3}$
Corner-cube	[111]	$-0.91 + 0.9N^{-1/3}$	0
Zig-zag chain	[111]	$-1.17 + 1.3N^{-1}$	$5N + 1$
Head-tail chain	[001]	$-2.01 + 0.95N^{-1}$	
Head-tail chain	[111]	$-0.95 + 1.2N^{-1}$	$(11N + 1)/2$

transformation is  $e_s > 2.9$  eV and almost size independent. Therefore, the only way to obtain super-spheres is through interaction with the suspension, as we will show later.

**3.2.3 Phase behaviour of [111] magnetised nanocubes: cluster size effects.** Table 2 lists energy scaling laws for different super-structures. It is found that the reduced energy per cube  $u_N$  is given by  $u_N = -2.15 + 1.307N^{-1/3}$  for super-cubes, which is slower than that in previously studied systems of magnetic tubes.<sup>53,54</sup> The reduced energy per magnet is  $u_{\infty}^{3D} = -2.15$  eV in a bulk material,  $u_{\infty}^{zz} = -1.17$  eV in an infinite chain of the fully touching cubes (zig-zag magnetisation) and  $u_{\infty}^{ht} = -0.95$  eV in head-tail chains. We found that the scaling laws for chain structures,  $u_N \sim N^{-1}$ , are in accordance with previous observations for one-dimensional dipolar structures made.<sup>52</sup>

To study the evolution of arrangements of [111] magnetised nanocubes with the strength of repulsive surface interaction we used scaling laws and calculated exact values of energy for different arrangements of polymorphs (*i.e.*,  $N < 27$ ). We start from minimal magnetic energy structures described in the previous section and analyse the difference in energy resulting from the surface coupling between particles, *i.e.*,  $e_s = \epsilon_{ss} d^2$ . When the surface repulsion increases  $e_s \gtrsim 0.6$ , the magnetic assemblies tend to increase the surface area.

The assemblies with  $N < 400$  will transcend into chains with partially touching cubes and head-tail magnetic configurations. This is somewhat surprising since the chains with fully touching faces have higher binding energy. Nevertheless, four times smaller contact surface of partially touching head-tail magnetised cubes makes them favourable as a minimal energy state over fully touching chains. The limiting energies are denoted with (green) squares in Fig. 7. With increasing repulsive coupling, we observe a transition to the so-called, corner-cube flakes. This remarkable transformation originates from the necessity to avoid any surface-to-surface contact while simultaneously increasing binding energy by minimising the dis-

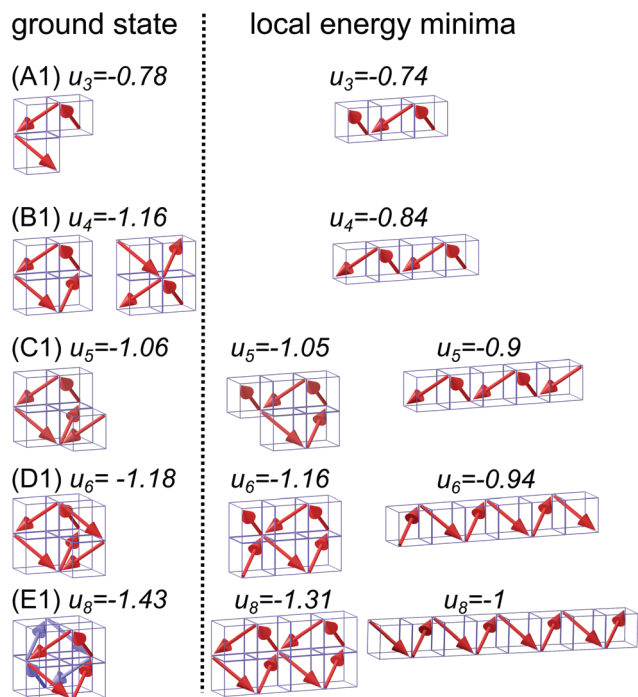


Fig. 5 Magnetic binding energy per particle ( $u_N$ ) of polymorphs with magnetisation in the [111] direction for  $N = 3, 4, 5, 6,$  and  $8$ . The ground state structures (left) and examples of non-ground state isomers (right) are shown. The uniformly magnetised cubes with  $d = 40$  nm side are considered with  $M_s = 160$  kA m $^{-1}$  magnetisation. The energies are given in electron-volts, *i.e.*, the reference energy is  $\nu = 1$  eV.

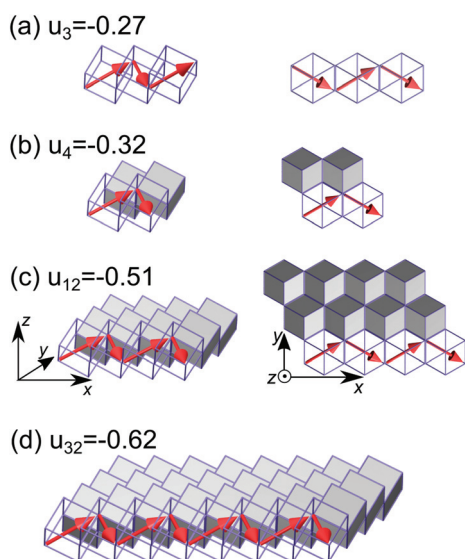


Fig. 6 Overview of the calculated magnetic energies per particle  $u_N$  of corner-cube flakes with  $N = 3, 4, 12,$  and  $32$  magnetic cubes. Side view (left) and top view (right) of the structures are given. One could observe a hexagon pattern seen in the experiment (*cf.*, Fig. 1K) in the top view. The uniformly magnetised cubes with the  $d = 40$  nm side are considered to have saturation magnetisation  $M_s = 160$  kA m $^{-1}$ . The energies are given in electron-volts, *i.e.*, the reference energy is  $\nu = 1$  eV.

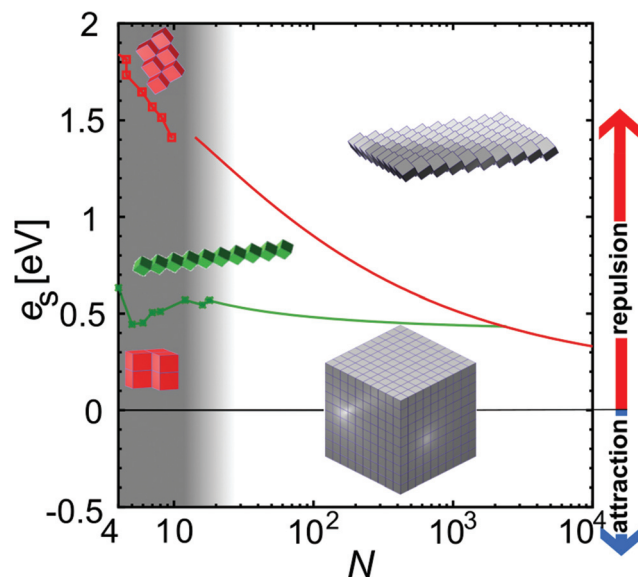


Fig. 7 Phase diagram of magnetic cubes, with a surface coupling  $e_s = \epsilon_s d^2$ , plotted as a function of the cluster size. The (green) squares, connected as a guide to the eye, represent polymorphs being composed only of a few particles located in the grey area which transcend directly into the chains of partially touching cubes with head-tail magnetic configurations. The (red) circles denote the upper limit of stability of head-tail chains above which they transform into corner-cube 2d structures. The right side of the diagram follows the phase transformation of large structures ( $N \geq 27$ ). The (green) full curve delimits the area of stability of super-cubes and chains and (red) dashed curve same for chains and corner-cube 2d structures. The uniformly magnetised cubes with  $d = 40$  nm side are considered to have saturation magnetisation  $M_s = 160$  kA m $^{-1}$ .

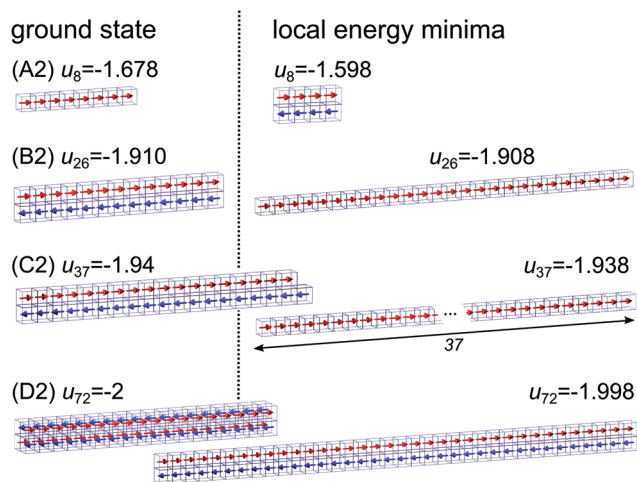
tance between cubes. The transition from the  $4 \times 4$  square to corner-cube square takes place for a surface coupling energy of  $e_s = 0.84$  eV. Fig. 6 gives an overview of corner-cube flakes. The constitutive chains have the magnetisation parallel to the patch longer side and ferromagnetic configuration. The magnetic binding energies are considerably higher than in the case of polymorphs,  $u_4^{cc} = -0.32$  eV,  $u_{12}^{cc} = -0.32$  eV, and  $u_{32}^{cc} = -0.62$  eV, see Fig. 6.

Our analysis shows that chains are energetically favoured transient structure only for small assemblies. For a large number of particles, *i.e.*,  $N > 400$ , the chain vanishes as an intermediate structure and there is a direct transition to corner-cube flakes, *cf.* Fig. 7. With an increasing number of magnetic cubes the binding energy of the corner-cube flake is converging to a value of  $u_{\infty}^{2D,cc} = -0.91$  eV. This binding energy is only about 42% of the value for the bulk magnetic cube structure, *i.e.*,  $u_{\infty}^{3D} = -2.15$  eV. The resulting limiting surface energy required to unrolling super-cube into a corner-cube surface converges to  $e_{cc}^{[111]} \approx (u_{\infty}^{2D,cc} - u_{\infty}^{3D})/3 = 0.41$  eV, *cf.* in Fig. 7.

### 3.3 Magnetisation [001]

**3.3.1 From chain to rods.** The computational cost of the search for the ground states is greatly reduced when we study [001] magnetisation along one side of the cube. The chains





**Fig. 8** Magnetic energy per particle ( $u_N$ ) as a function of number of cubes ( $N = 8, 26, 37$ , and  $72$ ) with magnetisation in the  $[001]$  direction. The ground state structures (left) and examples of non-ground state isomers (right) are shown. The uniformly magnetised cubes with  $d = 40$  nm side are considered with  $M_s = 160$  kA m $^{-1}$  magnetisation.

have minimal binding energy for  $N \leq 25$ . Beyond  $N = 25$ , we observe different behaviour for even (*i.e.*,  $N = 2k$ ,  $k \in \mathbb{N}$ ) and uneven number ( $N = 2k + 1$ ) of particles. For an even number of particles  $26 \leq 2k \leq 70$ , a ribbon composed of two chains is created, see Fig. 8(A2). The configuration is antiferromagnetic, *i.e.*, the two chains have magnetisation. At this point, energy increase due to breaking one chain into two is offset by the magnetic interaction of the resulting two touching chains. This configuration is followed by a three-dimensional rod with a square  $2 \times 2$  profile between  $72 \leq 4k \leq 224$ , *cf.* Fig. 8(D2). For an uneven number of particles, the chains remain stable until  $2k + 1 \leq 37$ , see Fig. 8(C2). Beyond this point, two touching chain configurations, with  $k$  and  $k + 1$  particles, become energetically favorable. The reason for this is a penalty of the ultimate particle, having only one neighbour, compared to the double chain composed of an even number of particles. As a result, the assemblies with unequally long chains exhibit higher binding energies and retarded transition to thicker rods. A further example is a transition from a double chain with  $4k + 2$  particles to a square-profile  $2 \times 2$  rod. This transition is taking place at  $4k + 2 \leq 86$ . The energy differences between competing states are quite small (less than 1% total energy) and also much smaller than the gain in binding energy due to the additional particle.

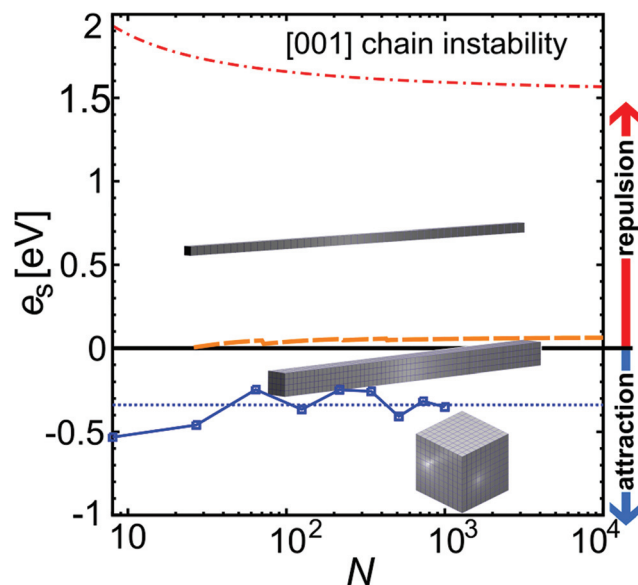
For simplicity, from now on, we will only consider rods composed of chains with equal length and analyse the evolution of the profile of the rods. We observe an almost smooth energy drop, see Fig. 4. This is reminiscent of behaviour seen in rods composed of magnetic spheres.<sup>52,55</sup> For  $N = 342$  magnetic nanocubes, we obtain  $2 \times 3 \times 57$  and for  $N = 992$ ,  $7 \times 7 \times 204 \times 4 \times 62$  rods.

**3.3.2 Phase behaviour of  $[001]$  magnetised nanocubes: cluster size effects.** Having now a good understanding of the

structural evolution of the minimal energy structures composed of  $[001]$  magnetised cubes we can capture geometrical properties of the super-rods as a function of  $N$ . More specifically, we consider the height  $h$  of the super-rod (parallel to the magnetisation axis of the cube) and its profile. Interestingly, while the super-rod growth scales in all three dimensions similarly  $N^{1/3}$ , the height grows  $h \approx 6.2N^{1/3}$  faster than the profile width  $w \approx 0.4N^{1/3}$ . The binding energy of the rods converges to  $u_\infty^{3D,[001]} = -2.15$  eV, *i.e.*, which is the same energy already found in the super-cubes of  $[111]$  magnetised particles. This is not physically surprising since a uniformly magnetised block of material should have the value of the binding energy independent of the orientation of the bulk magnetisation.

In Fig. 9, the diagram shows boundaries between different classes of structures built with  $[001]$  magnetised nanocubes concerning the number of building blocks and the surface interaction energy. The size effects on the stability of different structures are weak and limited to agglomerates with  $N < 100$  nanocubes. The energy of infinite chains is  $u_\infty^{ht,[001]} = 2.01$  eV. Therefore, the limiting surface repulsion energy necessary to prevent creation of very large three dimensional agglomerates is  $\epsilon_s^{[001]} = (u_\infty^{ht,[001]} - u_\infty^{3D})/2 \approx 0.07$  eV.

The surface attraction tends to reduce the external surface and increase the number and size of the contacts between cubes. As we already discussed, the super-cube is the most



**Fig. 9** The phase diagram for magnetic  $[001]$  nanocubes with a surface coupling  $e_s$  plotted as a function of the cluster size  $N$ . The (blue) squares, connected as a guide to the eye, represent the transition from super-rod to regular super-cube for  $N = 8, 27, 64, 125, 216, 343, 512, 729$ , and  $1000$ . The dotted blue line is a trend from the energy scaling laws for the energy of super-rods and super-cubes. The dashed (orange) curve is an upper limit of the stability of super-rods above which they transform into head–tail chains. The dashed-dotted (red) curve represents the limit of stability of the chains. The uniformly magnetised cubes with  $d = 40$  nm side are considered to have saturation magnetisation  $M_s = 160$  kA m $^{-1}$ . The energies are given in electron-volts, *i.e.*, the reference energy is  $\nu = 1$  eV.

compact super-particle regarding the surface to volume ratio. Based on scaling laws for [001] super-cubes and rods, we estimate that the critical surface attraction is given by  $\epsilon_s \approx -0.4$  eV for  $N \gg 1$ , beyond which super-cubes will form in [001] systems, *cf.*, Fig. 9.

### 3.4 Surface tension effect: can super-spheres win?

Up to this point, we have analysed only inter-particle interactions. The suspension can have a profound effect on self-assembly and we will show that magnetic nanocubes are an interesting system in that respect. Using our numerical results we look into magnitudes of surface tension and effective surface area required to induce a transformation from the super-cube to super-sphere. Thus the effective surface controlled by size-dependent hydration, as predicted by the LCW theory,<sup>48</sup> plays a significant role in the formation of super-particles. Large curvatures, *i.e.*, steps and corners of hydrophobic surfaces, lead to very high local values of surface energy. The suspension liquid cannot fill corners created by kinks and steps of the structure. The exterior surface of nanocubes in agglomerate represents the upper limit for the value of an effective surface and the lower limit is a smooth surface fully enveloping the agglomerate. In our case, the difference between the super-cube and super-sphere arises from the geometry of their exterior surface. While the super-sphere has a few, if any, flat surfaces, super-cube has six flat sides. In the case of the super-cube, therefore, the effective surface area will be equal to its surface. In the case of the super-sphere, there is a range of possible values for the effective surface area depending on the quality of wetting. The upper limit of this range for good wetting is determined by the true surface of the super-sphere,  $S^{\max} = 7.4N^{2/3}d^2$ , *cf.* Table 2. The surface of a perfect sphere with a volume of  $Nd^3$  is  $S^{\min} = (36\pi)^{1/3}N^{2/3}d^2 \approx 4.83N^{2/3}d^2$  and represents a lower boundary for the effective surface area. To obtain a super-sphere, its effective surface area has to be smaller than the surface of the super-cube, *i.e.*,  $6N^{2/3}d^2$ . In this way, surface energy will offset the energy penalty for the magnetically less-favourable configuration of the super-sphere. To have a smaller effective surface of the super-sphere, we need a liquid that does not fully wet the surface.

In the following, we will discuss how the surface tension magnitude  $\gamma$  of real liquids and the effective surface area change balance between the super-sphere and super-cube. We define the critical surface energy  $\gamma_c S^{\text{eff}}$  as the energy at which the super-sphere and super-cube have the same energy. The total energy of the system due to molecular interactions is  $U + \gamma_c S^{\text{eff}}$  where  $U$  is the total interaction energy in the system due to magnetic coupling between particles. We obtain  $\gamma_c = \frac{\mu_0}{4\pi} \frac{\Lambda}{6 - \sigma} M_s^2 d$ , where  $\sigma$  is the effective surface factor given by  $\sigma = [4.83, 7.4]$  (the lower boundary stands for no wetting and the upper one for full wetting of the super-sphere surface) and  $\Lambda$  is an energy parameter which depends on magnetisation,  $\Lambda = 0.92$  for [111] and 0.98 for [001] magnetisation (from scaling laws for energy per particle in Table 2). For a fully spherical effective surface formed by magnetite cubes (magne-

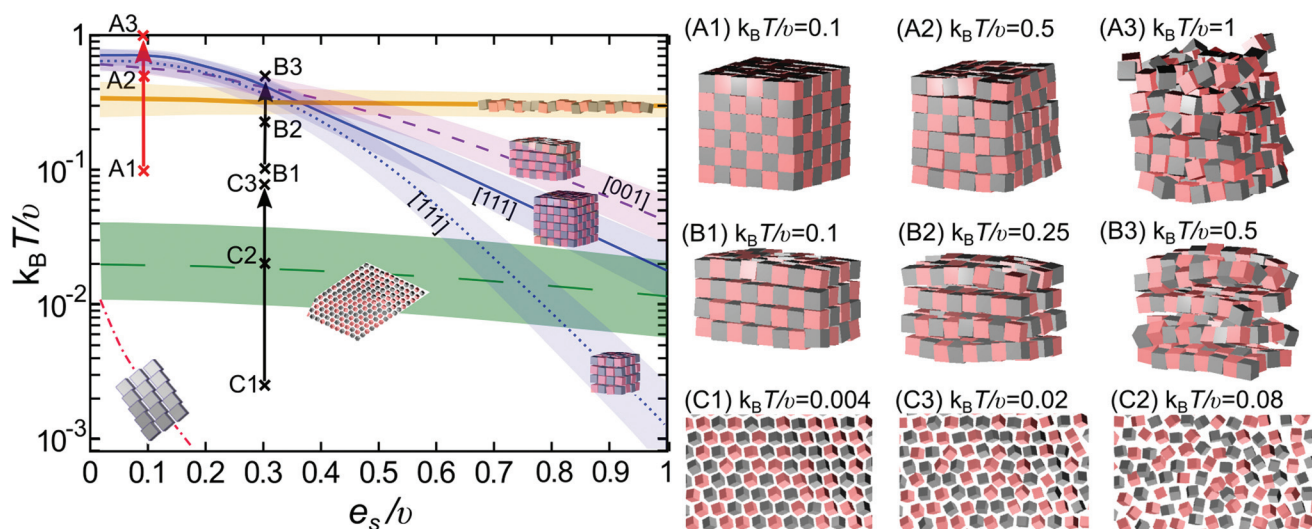
tisation [001],  $M_s = 160 \text{ kA m}^{-1}$  and  $d = 40 \text{ nm}$ ), we obtain  $\sigma = 4.83$  and  $\gamma_c^{\min} = 96 \text{ } \mu\text{N m}^{-1}$ , which is significantly lower than the typical surface energy of any solvent. For smaller magnetic particles, the value of  $\gamma_c^{\min}$  decreases. Therefore, the super-particle wettability predicted by the LCW theory plays a major role in tuning of the equilibrium shape of super-particles by steering the balance between the bulk and the surface energy terms in minimising the overall energy.

### 3.5 Finite-temperature behaviour

Having thoroughly analysed the energies of different configurations at the zero temperature limit, we can now proceed to an evaluation of the results obtained from the simulation at finite temperatures. At this point, it is important to note that kinetic energy  $k_B T$  of the particles enters as a third factor in energy balance that determines the structure along with magnetic and surface energies. If the kinetic energy is comparable to the interaction energies, the thermal motion influences the system. Since the size of the magnetic cubes has a strong effect on their reference magnetic binding energy  $\nu$ , we show results in scaled units  $k_B T/\nu$  in Fig. 10. We have followed the evolution of potential energy with temperature for several configurations (*e.g.*, corner-cube flake, [111] super-cube, [001] super-rod, and [111] chain) and define a transition temperature based on the change in heat capacity of the cluster. The delimiting lines and uncertainty regions are interpolated through discrete points obtained from molecular dynamics simulations. We have crosschecked the results of the analysis with snap-shots and there is a clear correlation with the evolution of the structure, *cf.* right panels in Fig. 10.

At low temperatures ( $k_B T \ll \nu$ ), the associated thermal fluctuations in the configurations are extremely small. We observe that the finite-range surface repulsion used in simulation influences the configurations at low temperatures. The super-rod of [001] magnetised cubes shows structural anisotropy, which originates from the anisotropy of magnetic interaction. The magnetic attraction is two times stronger in the magnetisation direction, *i.e.*, the long axis of the super-rod, than in the orthogonal plane. The cubes separate more in directions where the magnetic attraction is weaker, *cf.* Fig. 10(B1). The cubes are separated by repulsion, while positions and magnetic orientation of the constitutive particles remain unchanged. The dilatation of the structure is a physical consequence of the finite range of the repulsion and in the experiment will depend on how the repulsive interactions are realised in the system, *e.g.*, adsorbed layers, polymers grafted to the surface, *etc.* We also observe in corner-cube flakes that particles do not touch each other due to repulsion Fig. 10(C1). With the increase of temperature, the [001] chains of magnetic cubes start to move and particles within chains rotate relatively to each other. With increasing temperature, the space between cubes created by repulsion gives the cubes additional freedom to move, reducing the influence of their shape anisotropy.

At elevated temperatures, in two and three-dimensional structures, both positional and magnetic orders disappear



**Fig. 10** The diagram (left panel) showing the thermal stability region of super-structures made of nanocube dependence on surface repulsion. The bold (yellow) line shows the stability limit for the [111] chain. The short-dashed (magenta) line shows stability region for [001] magnetised super-rod with  $N = 128$  nanocubes, dotted (blue) line for the [111] magnetised super-cube with  $N = 64$  nanocubes, full (blue) for [111] magnetised super-cube with  $N = 216$  nanocubes, and long-dashed line (green) corner-cube flake with  $N = 180$  nanocubes. The right side panels show snapshots of the evolution of structure with temperature for the [111] super-cube (A1, A2, A3), [001] super-rod (B1, B2, B3), and [111] corner-cube two-dimensional structure (C1, C2, C3). The positions of the configurations in parameter space are also shown on the left panel. The results are material and scale-independent. If uniformly magnetised cubes are considered to have saturation magnetisation  $M_s = 160 \text{ kA m}^{-1}$ , the reference energy and temperature depend on the particle size. For  $d = 15$  and  $40 \text{ nm}$ ,  $\nu = 50 \text{ meV}$  and  $\nu = 1 \text{ eV}$ , respectively. The particles are coloured differently to make them more distinguishable.

while constituent cubes stay connected inside a disordered cluster. Due to stronger binding within the three-dimensional structure for surface repulsion  $e_s < 0.3$ , the super-rods are more stable compared to chains, *cf.* dashed curve in Fig. 10. The change of structure with increasing surface repulsion is not isotropic. We observe that with an increasing repulsion, the structure splits into the assembly of aligned head-tail chains (attraction inside the chain is two times stronger than between the chains). The thermal motion makes individual cubes oscillate around their equilibrium positions. As a result, the chains are pushed away from each other to accommodate the movement. At sufficiently elevated temperatures, the bundle of [001] chains is created and lateral order (alignment) disappears. Also, the cubes in these head-tail magnetised chains start to rotate around their magnetisation axis, breaking face-to-face order within the chain. The transition temperature from super-rod to a [001] chain bundle decreases with surface repulsion  $e_s$ .

The distance between single cubes increases homogeneously in the [111] super-cube with increasing surface repulsion and temperature. Melting of the cubic structure takes place when the cubes are sufficiently separated and can rotate freely around their magnetic axis. Assembly changes shape and takes the form of a spherical cluster after melting. The melting takes place first at the surface since the surface particles have fewer neighbours to constrain them geometrically and through magnetic interactions. Likewise, we also observe the size stabilisation of the super-cubes, *i.e.*, larger super-cubes melt at a higher temperature. Fig. 10 demonstrates size

stabilisation. The evolution of the melting temperature with surface energy for  $e_s$  for  $N = 64$  and  $216$  particle super-cube is denoted with dotted and full (blue) curves, respectively.

For corner-cube flakes, we observe a discrepancy between the stability predicted by analytic theory and simulation. The reason is that simulations produced a far greater separation between edges even for small surface repulsion  $e_s < 0.3$  than seen in the experiment, *cf.* Fig. 10(C1). This resulted in the structures being less stable than indicated by the analytical results. The probable reason is that our model does not capture the strong repulsion of the surfaces and weak repulsion between the edges. Our interpretation of the mechanisms of corner structures attributes their formation to the combined strong magnetic attraction between particles in edge contact and surface repulsion, preventing them from closing into a three-dimensional cluster, achievable by grafting polymers on them.

The chain of [111] magnetised cubes stays connected up to  $k_B T/v < 0.35$  even if particles are made very repulsive, *i.e.*,  $e_s > 0.5$  see the bold line (yellow) in Fig. 10. The nanocubes reduce their surface energy by rotating away from full face-to-face contact. In the case of the chain, such rearrangement of particles does not alter the long-range order or make the chain disconnect.

## 4 Discussion

The competition between shape and magnetic anisotropies offers various pathways for self-assembly. To explore the struc-

ture of polymorphs ( $N \leq 27$ ), analytical calculations are combined with a systematic search for ground states. Two orientations of the dipole relative to the cube geometry were considered, namely in the crystallographic directions [001] and [111]. For magnetic anisotropy in the [001] direction, linear chains have minimal binding energy for  $N \leq 25$ . Beyond  $N = 26$ , we observe complex re-entrant behaviour. Between  $26 \leq N \leq 72$ , for an even number of particles, the ground state is an antiferromagnetic ribbon, and the structure has a closed magnetic flux. For an uneven number of particles, the chain remains in the ground state and does not enclose the magnetic flux. The strong finite-size effects found in dipolar systems are responsible for the persistence of the chains as the ground state.<sup>52</sup> Beyond  $N \geq 72$ , three-dimensional antiferromagnetic rods were found as ground states. In the case of [111] magnetised cubes, the ground state was found to consist of structures derived from a simple square lattice resulting in the super-cubes seen in experiments, *cf.* Fig. 1E and G. The surface minimisation and the interplay of the magnetic anisotropy and the cube geometry, which in turn form antiferromagnetic alternating magnetic order, are the driving mechanisms leading to the formation of the super-cube.

The creation of directed non-close-packed arrangements is a technological challenge. We depart in our consideration from ground-state configurations found in polymorphs ( $N \leq 27$ ) and compare them with the configurations found in experiments. We study the transition between different states with increasing repulsion surface energy. For magnetisation [001], the linear chain becomes the minimal energy state for repulsive surface coupling energies higher than 4% magnetic bulk binding energy. The [111] magnetised cubes will transit into a chain structure only in a range of surface repulsive energies and for small and intermediate numbers of constitutive particles  $N < 400$ . The limit of stability of compact three-dimensional structures also lies around 60% of the magnetic binding energy of the cubes. The strong repulsion still does not result in the fully stretched chains with cubes touching only at the corners. Instead, the system collapses into a corner-cube two-dimensional configuration with the cubes in contact over the edges. Surface coupling, repulsive or attractive, has a profound influence on the magnetic order of the assembled structures. Dense configurations, such as super-rods or super-cubes, are antiferromagnetic, while non-closed-packed arrangements, such as chains and corner-cube planes, are ferromagnetic.

The results revealed vanishing differences in the binding energy between different super-structures, *cf.*, in Fig. 4, due to the insertion of additional nanocubes or between different isomers. Even for the smallest considered assemblies – polymorphs containing only several particles (*cf.*, Fig. 5 and 8), these differences in energy per particle were comparable to the thermal fluctuations at room temperature. Such a small difference in energy can result in the formation of the non-ground state structures seen in the experimental realisation of polymorphs. The probability of proliferation of non-ground state structures decreases with the magnitude of the energy difference between non-ground states and the ground state. In the

case of the super-structures, energy differences due to the addition of a nanocube or between different structures with similar numbers of nanocubes decreased with the number of particles following the  $N^{-1/3}$  scaling law for the two and three-dimensional structures. Nevertheless, the total energy differences of these structures increase with system size as  $N^{2/3}$  leading to the formation of fairly regular super-structures such as super-cube, super-rods, or corner-cube flakes.

The morphology provides an insight into the particle magnetisation. This is particularly useful in situations where electron holography<sup>42</sup> measurements are not possible (*e.g.*, large three dimensional systems or if the assembly is densely deposited on the substrate). The direction of the net magnetic orientation relative to the cube geometry changes the geometrical structure of the assembly. For chains of nanocubes, the assembly mechanism drives the particles to adopt structures that create a head–tail configuration, very much like chains of magnetic beads.<sup>53,54</sup> In the case of the [001] direction, this leads to a deep central minimum of magnetic potential energy for the lateral movement of the magnetic particles with respect to their magnetisation and consequently to a quite stiff linear configuration in the presence of surface repulsion ( $e_s > 0.07$  eV) or rod-like structures otherwise. In contrast, when the magnetisation is along the principal axis, *i.e.*, [111] direction, the structure becomes more flexible under repulsion ( $e_s \gtrsim 0.6$  eV) or symmetric super-cubes are formed. We find that the overall picture concerning the magnetization of the 3d nanoparticles assemblies is fairly clear: the individual dipole moments tend to cancel each other in antiferromagnetic configurations. Only exception are 2d corner-cube flakes, where we find a ferromagnetic zigzag magnetic configuration.

## 5 Conclusion

We demonstrate a rich variety of structures and non-close-packed arrangements that can be engineered from nanocubes with a combination of surface interaction and magnetic dipole–dipole coupling. Our results are in good agreement with the experimentally obtained structures. The model studied here approaches systems where interparticle energies of interaction are much higher than the thermal energy of the particles. In most of the structures, particles assemble forming flat surfaces to avoid getting trapped in local minima. We established the relationship between arrangement, [100] and [111] magnetic anisotropy, surface interaction, and size of the system. The results are scalable and our approach is valuable to research aimed at the application of novel magnetic super-structures and to direct the self-assembly of unique structures at different scales. The directed assembly of structures opens up new possibilities in materials science in terms of tuning properties through the balance of surface and magnetic interactions, which is of practical relevance in many areas of research, including biomedical materials, energy applications, and complex nanoarchitectures for metamaterial coatings or plasmonic elements.

## Conflicts of interest

There are no conflicts to declare.

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