



# Massive quantum regions for simulations on bio-nanomaterials: synthetic ferritin nanocages†

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**QM/MM molecular dynamics simulations on the 4His- $\Delta C^*$  protein cage have been performed using multiple active zones (up to 86 quantum regions). The regulation and nanocage stability exerted by the divalent transition metal ions in the monomer-to-cage conversion have been understood by comparing high level quantum trajectories obtained using  $Cu^{2+}$  and  $Ni^{2+}$  coordination ions.**

Biomacromolecules with highly ordered architectures, which play an important role in living organisms, have inspired the creation of new biomaterials with diverse functionalities. Among them, synthetic protein cages (PCs) have received increasing attention since the multi-functionality that each cage can hold is compatible with a wide range of applications.<sup>1</sup> PCs can transport important drugs in the interior voids, while the exterior surface can protect the interior load or can be modified with functional ligands for targeting goals. These distinctive features have made modified PCs potentially interesting vehicles for drug delivery.<sup>2</sup>

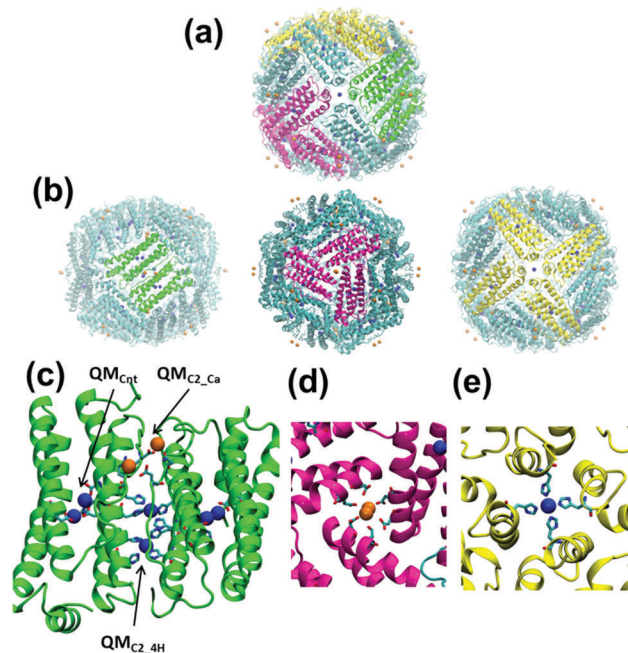
Ferritin PCs are particularly attractive because their subunits self-assemble into spherical nanoparticles with outer and inner diameters of 12 and 8 nm, respectively.<sup>3</sup> Ferritin nanocages, which remain intact under non-native conditions (*e.g.* high pH and temperature), are broken down into individual subunits under acidic conditions, recomposing at neutral pH.<sup>3</sup> Due to this phenomenon, ferritin has been proposed as a carrier to transport encapsulated drugs through the human body.<sup>4</sup>

Modified ferritin PCs are highly cooperative symmetrical structures made from a small number of protein building blocks.<sup>5</sup> Huard *et al.*<sup>6</sup> recently engineered a PC, named 4His- $\Delta C^*$  (Fig. 1a), by self-assembling a recombinant ferritin variant.

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Although 4His- $\Delta C^*$  is indistinguishable from the wild-type protein in terms of assembly, stability and function, its monomer-to-cage conversion is selectively regulated by  $Cu^{2+}$  at pH 7 (*i.e.* other divalent ions, such as  $Zn^{2+}$  and  $Ni^{2+}$ , produce a much lower yield of 24-mer formation). Accordingly, 4His- $\Delta C^*$  opens



**Fig. 1** (a) Top view of the Cu-4His- $\Delta C^*$  cage. (b) Alternative views of the Cu-4His- $\Delta C^*$  cage:  $C_4$  pore interface view through the  $C_2$  symmetry axis (left);  $C_3$  pore interface view through the  $C_3$  symmetry axis (middle); and  $C_2$  pore interface view through the  $C_4$  symmetry axis (right). (c) The general view of the quantum regions in the  $C_2$  dimer interface. Details of the two  $Cu^{2+}$  coordination sites through His residues ( $QM_{C_2_{4H}}$ ), the two  $Ca^{2+}$  coordination sites ( $QM_{C_2_{Ca}}$ ), and the two  $Cu^{2+}$  coordination sites at the centre of the monomer ( $QM_{Cnt}$ ). (d) Details of the quantum region in the  $C_3$  pore interface and (e) the  $C_4$  pore interface in the Cu-cage. The  $C_2$ ,  $C_3$  and  $C_4$  pore interfaces are highlighted in green, pink and yellow, respectively. The transition metal ( $Cu^{2+}$  or  $Ni^{2+}$ ) and the  $Ca^{2+}$  ions are highlighted in blue and orange, respectively.



the possibility of hiding therapeutic agents inside modified cages under physiological conditions for targeting delivery.<sup>7,8</sup> However, the roles played by metal–ligands in the assembly and disassembly of cages, which are relevant for future developments, remain unclear. Explanatory simulations of this complex system require accurate description of the metal ligand associated with each subunit and consideration of the synergies among the 24-subunits. This can be successfully achieved using a multi-scale strategy based on the *maz*-QM/MM-MD scheme, whose QM region is defined as the sum of several disjoint QM subregions (or active zones, AZs) but following the general QM/MM approach to obtain the energy and its gradients (forces). Thus, any particle within an AZ is subject to QM forces from the electronic wave function. However, the interactions with the other AZs are treated through electrostatic interactions (forces from point charges), similar to the rest of the MM region (see the ESI†).<sup>9,10</sup>

In this work we have used the *maz*-QM/MM-MD method to examine the stability of both the C<sub>2</sub> dimer interface and the complete cage of 4His-ΔC\*. The former consists of two four-helix bundle monomers linked by four metallic coordination sites involving residues of both monomers, while the latter is made of 24 four-helix bundle monomers arranged in octahedral (432) symmetry. The influence of the coordination ion on the stability of the dimer interface has been analysed considering Cu<sup>2+</sup> and Ni<sup>2+</sup> coordination ions. Each system, hereafter denoted as Cu- and Ni-dimers, involved six coordination environments (quantum regions) with a total of 188 quantum atoms (Fig. 1b and Fig. S2, ESI†): two coordination sites involving Cu<sup>2+</sup> or Ni<sup>2+</sup> transition metal ions (QM<sub>C2\_4H</sub>), two sites coordinating Ca<sup>2+</sup> ions (QM<sub>C2\_Ca</sub>), and two coordinated metal regions in the center of each monomer (QM<sub>Cnt</sub>). Besides, the study on the stability of the whole 4His-ΔC\* sphere was conducted considering 86 quantum regions (*i.e.*, all coordination spheres of either Cu<sup>2+</sup> or Ni<sup>2+</sup>, and Ca<sup>2+</sup> ions in the PC) with a total amount of 2830 quantum atoms. The resulting model (Fig. 1c), denoted as the Cu-cage, comprised 12 C<sub>2</sub> dimer interfaces, 8 C<sub>3</sub> pore interfaces, and 6 C<sub>4</sub> pore interfaces. The average time used for each MD step was about 270 s using 256 processors for the dimer and 1900 s using 928 processors for the whole protein. The present work is the most ambitious and mature application of the PUPIL<sup>11</sup> software so far. To the best of our knowledge, this is the first attempt to face a simulation with such a massive number of quantum regions within the QM/MM framework and, therefore, results have provided relevant information on both the 4His-ΔC\* PC and the viability of the *maz*-QM/MM-MD approach when applied to huge biological systems.

Analysis of the *maz*-QM/MM-MD trajectory of the Cu-dimer in explicit water indicates that the distances between the metal ions and the atoms from the coordination groups are in good agreement with X-ray crystallographic values for the Cu–ferritin cage, though the former are more homogeneous than the latter (Table S1, ESI†). However, metal···metal distances between closer AZs experience a significant increase with respect to experimental data. For example, Cu<sup>2+</sup>···Cu<sup>2+</sup> from QM<sub>C2\_4H</sub> regions and Ca<sup>2+</sup>···Ca<sup>2+</sup> from QM<sub>C2\_Ca</sub> are overestimated by 0.26 Å (3%)

and 1.06 Å (13%) with respect to experimental data. The largest difference corresponds to the Cu<sup>2+</sup>···Cu<sup>2+</sup> distances of atoms located at the center of each monomer in QM<sub>Cnt</sub> regions, which are 0.80 and 0.94 Å (23.5% and 27.6%, respectively) larger than the equivalent X-ray values. These differences are due to the highly solvated environment of the simulated system when compared with experimental data derived from hydrated protein crystals. However, we want to note the shorter metal–ligand distances of QM<sub>Cnt</sub> AZ obtained from *maz*-QM/MM-MD calculations considering the solvated environment that accentuates the separation between the two metals.

On the other hand, metal–ligand distances from simulations on the Ni-dimer are on average larger than those obtained for the Cu-dimer in a range of about 0.5–2% depending of the AZ (Table S1, ESI†). Differences are particularly acute in one of the two QM<sub>C2\_Ca</sub> regions in which Ca<sup>2+</sup> experiences a change in the coordination pattern (*i.e.* from three protein ligands in the Cu-dimer to two protein ligands in the Ni-dimer). Besides, metal–metal distances in the QM<sub>C2\_4H</sub> and QM<sub>C2\_Ca</sub> regions are larger for the Ni-dimer than for the Cu-dimer by 5.3% and 8.9%, respectively, whereas the AZs of QM<sub>Cnt</sub> shrink by 1% and 3.5%. These geometric differences reflect the different metal–ligand behavior between Cu<sup>2+</sup> and Ni<sup>2+</sup> and support the hypothesis that Ni<sup>2+</sup> introduces changes in the stability of the C<sub>2</sub> interface in 4His-ΔC\*.

Table 1 describes the coordination of water molecules to metal ions in Cu- and Ni-dimers, which were derived from the radial distribution functions (RDFs) calculated for metal–O(water) atom pairs. Interestingly, no significant difference is detected between Cu<sup>2+</sup> and Ni<sup>2+</sup> hydration patterns. The square planar organization of the QM<sub>C2\_4H</sub> AZ presents one coordinated water molecule that remains stable during the simulation at a distance of ~1.9 Å. This Cu<sup>2+</sup>–water coordination site was also observed in the crystal structure, even though the Cu<sup>2+</sup>–O(water) distance was of 2.96 Å. The QM<sub>Cnt</sub> AZ shows a fractional coordination number since one of the three existing water molecules is shared between the two metal ions. The three water molecules located in the latter AZ were already found in the crystallographic structure with metal–O(water) distances of 1.88, 1.99 and 2.26 Å. Finally, although Ca<sup>2+</sup> ions in QM<sub>C2\_Ca</sub> AZ are not explicitly coordinated, they interact with five water molecules that form the first solvation shell. The average metal–O(water) distance is 2.50 Å, while in the crystal structure the closer water is at 3.96 Å.

Hydrogen bonds involving the Tyr39 and Asn74 residues of Cu-4His-ΔC\* were reported to be away from the C<sub>2</sub> interface,

**Table 1** Water molecules coordinated to the metal ions in Cu- and Ni-dimers. The distance,  $d_{\max}$  (Å), corresponds to the maximum of the first peak in the metal–O(water) RDF, while CN is the coordination number

Interface	Cu-dimer		Ni-dimer	
	$d_{\max}$	CN	$d_{\max}$	CN
QM <sub>C2_4H</sub>	1.85	1.0	1.87	1.0
QM <sub>C2_Ca</sub>	2.50	4.8	2.50	4.5
QM <sub>Cnt</sub>	M <sub>1</sub>	1.86	1.84	1.5
	M <sub>2</sub>	1.84	2.5	1.86



even though such residues are located near the inner cage surface.<sup>6</sup> This hydrogen bonding network, which is involved in the stability of the cage structure and the C<sub>2</sub> interface, is sensitive to the divalent metal. In fact, monomer-to-cage conversion was observed for Cu-4His-ΔC\* in the presence of divalent ions (e.g. Cu<sup>2+</sup>, Zn<sup>2+</sup> and Ni<sup>2+</sup>), whereas the ferritin variant MIC1 (4His-ΔC\* with Y39E, N74E and P88A mutations) exhibited a drastic dependence on the metal ion for the formation of cages (i.e. the cage was not formed in the presence of Ni<sup>2+</sup> while the highest extent of cage formation was observed with Cu<sup>2+</sup>). In the MIC1, hydrogen bonds involving Tyr39 and Asn74 were suppressed from the C<sub>2</sub> interface while Glu39, Glu74 and Asp42 added some additional electrostatic interactions.<sup>6</sup>

Simulations on Cu- and Ni-dimers of the 4His-ΔC\* protein have clarified the influence of the metal ion on the interface, which can be difficult to model using a simple classical MD approach due to the complex metal–ligand bond coordination. In addition, *maz*-M/MM-MD trajectories take into account the influence of environmental effects on the stability of the C<sub>2</sub> interface.

Table S2 (ESI<sup>†</sup>) sorts by occupation the main hydrogen bonds in both Cu- and Ni-dimers for values over 10% (i.e. percentage of the stored snapshots in which the hydrogen bond is formed). Although the Ni<sup>2+</sup> instability on the ferritin variant MIC1 seems to occur due to the Y39E and N74E mutations, analysis of hydrogen bonds reflects differences between the metal ions before mutation from 4His-ΔC\* to MIC1. Thus, the importance of the Tyr39···Asn74 hydrogen bond in the C<sub>2</sub> interface stability is much higher for the Ni-dimer (83% and 77% for Y39···N74' and Y39'···N74, respectively) than the Cu-dimer (38% and 25% for Y39···N74' and Y39'···N74, respectively). This is consistent with the fact that, after mutation, the new Glu39 and Glu74 residues induce major repulsive charge interactions within the C<sub>2</sub> interface of the Ni-dimer compared to that of the Cu-dimer. Besides, Asn74···Asp42, Tyr39···His67 and Tyr39···Lys71 hydrogen bonds contribute to the instability of the cage in the presence of Ni.<sup>2</sup>

The whole Cu-cage metalloprotein was modelled to determine the main interactions on the rest of the ferritin interfaces: C<sub>4</sub> and C<sub>3</sub> (Fig. 1). The former is responsible for the union of four monomers by means of a Cu<sup>2+</sup> ion, and the latter for the union of three monomers by means of two Ca<sup>2+</sup> ions. This simulation, which represented a very challenging task due to the huge amount of AZs involved in the system, should also be considered as a proof of principle of the *maz*-QM/MM MD methodology for large and complex biological systems. Thus, the 86 AZs include the Cu<sup>2+</sup> and Ca<sup>2+</sup> ions contained in all the C<sub>2</sub>, C<sub>3</sub> and C<sub>4</sub> interfaces of the cage.

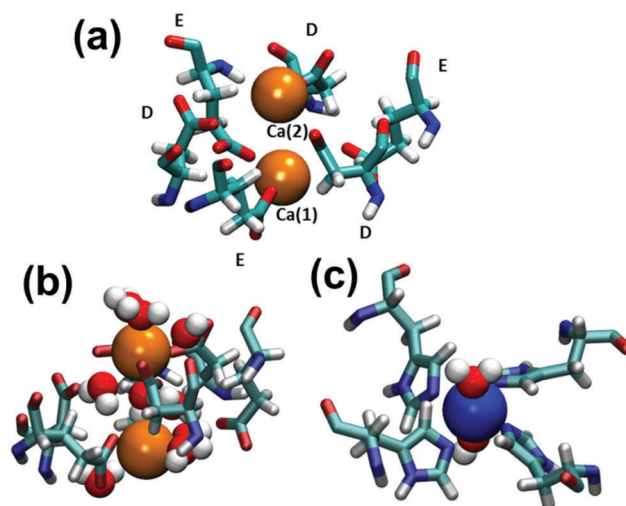
Simulation of the Cu-cage involved a huge computational effort since 63% of AZs (i.e. the 54 zones with coordinated Cu<sup>2+</sup> ions) have a difficult convergence. Furthermore, the communications between different parts of the program were under stress due not only to the vast size of the simulated system but also due to the differences between AZs (i.e. the computational time varies with the number of atoms and metallic ions). As the algorithm responsible for sharing computational resources for

**Table 2** Ligands and water molecules coordinated to the metal ions of the Cu-cage. The distance,  $d_{\max}$  (Å), corresponds to the maximum of the first peak in the metal–O(water) RDF, while CN is the coordination number

Interface	M–X	$d_{\max}$	CN	
QM <sub>C4_4H</sub>	Cu <sup>2+</sup> –H@N	2.18	4.0	
	Cu <sup>2+</sup> –WAT@O	1.83	2.0	
QM <sub>C3_Ca</sub>	M <sub>1</sub>	Ca <sup>2+</sup> –E@O1	2.38	3.0
		Ca <sup>2+</sup> –WAT@O	2.40	4.2
	M <sub>2</sub>	Ca <sup>2+</sup> –D@O1	2.37	3.0
		Ca <sup>2+</sup> –WAT@O	2.41	5.0
		Ca <sup>2+</sup> (1)–Ca <sup>2+</sup> (2)	4.01	1.0

minimizing the execution time plays an important role, the software<sup>11,12</sup> was re-engineered to parallelize the construction and simulation mechanism of each AZ independently using the distributed client–server architecture. A client (QMWorker) was created to build, simulate, and manage the information of each AZ, which is exchanged and updated at each iteration cycle with the main program. QMWorkers were distributed equitably between the different calculation nodes of the system in order to avoid memory problems and accelerate the process. On the other hand, the best performance was achieved when the number of calculation nodes is equal to the number of AZs (QMWorker) for an equivalent load distribution among them.

Table 2 lists the metal–ligand distances and the water coordination number on the C<sub>3</sub> and C<sub>4</sub> pore interfaces, derived from the RDFs calculated for the Cu-cage trajectory. Although the square planar organization of the C<sub>4</sub> pore interface is very similar to the QM<sub>C2\_4H</sub> AZs of the C<sub>2</sub> interface, two coordinated water molecules were observed in the former while the latter presents a single water molecule only due to steric effects. Moreover, the coordination of Cu<sup>2+</sup> at the C<sub>4</sub> interface is similar to that observed by crystallography (Fig. 2c). However, Ca<sup>2+</sup> ions at



**Fig. 2** (a) Averaged structure of the C<sub>3</sub> pore interface. The metal ions and their coordination sphere are shown. E and D refer to Asp and Glu residues, respectively. Details about the metal coordination with protein residues and water molecules for the (b) C<sub>3</sub> and (c) C<sub>4</sub> pore interfaces are also shown. All figures were extracted from the simulation of the whole Cu-cage system.



the C<sub>3</sub> interface present some difference in water coordination: one is coordinated by 3 Glu residues and 4 water molecules meanwhile the other is surrounded by 3 Asp residues and 5 water molecules (Fig. 2a). The ligands are arranged in an alternated order with maximum probability distances of 2.37–2.38 Å to the closest carboxylic oxygens of Glu and Asp residues. Indeed, the C<sub>3</sub> interface exhibits three additional water molecules compared with X-ray crystallography (Fig. 2b). These are located among Ca<sup>2+</sup> ions acting as a bridge between the metal ions and the more distant carboxylic oxygens of the ligands, which increases the stability of the C<sub>3</sub> pore interface.

In summary, multi-scale simulations presented in this work prove that the C<sub>2</sub> interface of 4His-ΔC\* is responsible for the stability of the system in the presence of divalent metallic ions. Ni<sup>2+</sup> ions affect the hydrogen bonding network at the C<sub>2</sub> interface, inducing the loss of interactions promoted by Cu<sup>2+</sup> ions. This explains that 4His-ΔC\* mutants do not form cage structures when Cu<sup>2+</sup> is replaced by Ni<sup>2+</sup>.<sup>6</sup> The multiscale relaxation of the entire Cu-cage protein, in which all Cu<sup>2+</sup> and Ca<sup>2+</sup> ions as well as their coordination spheres have been represented at ab-initio level, corroborates the great potential of the *maz*-QM/MM-MD methodology to model the chemical synergies induced by the different subsystems in very large biological systems. Results have evidenced the key role of C<sub>3</sub> and C<sub>4</sub> interfaces in the stability of the whole nanocage.

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## Conflicts of interest

There are no conflicts to declare.

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