

Computational Insights into the Binding of Monolayer-Capped Gold Nanoparticles onto Amyloid- β Fibrils

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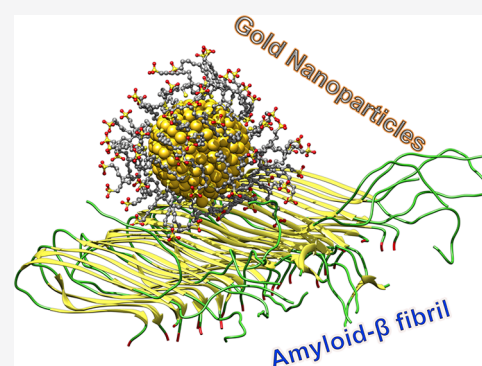
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ABSTRACT: Amyloids- β ($A\beta$) fibrils are involved in several neurodegenerative diseases. In this study, atomistic molecular dynamics simulations have been used to investigate how monolayer-protected gold nanoparticles interact with $A\beta(1-40)$ and $A\beta(1-42)$ fibrils. Our results show that small gold nanoparticles bind with the external side of amyloid- β fibrils that is involved in the fibrillation process. The binding affinity, studied for both kinds of fibrils as a function of the monolayer composition and the nanoparticle diameter, is modulated by hydrophobic interactions and ligand monolayer conformation. Our findings thus show that monolayer-protected nanoparticles are good candidates to prevent fibril aggregation and secondary nucleation or to deliver drugs to specific fibril regions.



KEYWORDS: Molecular dynamics simulation, binding affinity, gold nanoparticles, amyloid fibrils, Alzheimer's

INTRODUCTION

Amyloid fibrils constitute a group of proteins involved in neurodegenerative (typically fatal) diseases such as Alzheimer's (AD), Parkinson's (PD), and Huntington's (HD) disease.^{1,2} In particular, β -amyloid peptides ($A\beta_{1-40}$ and $A\beta_{1-42}$) are responsible for fibrous plaque formation in AD,³ which causes a progressive loss of memory, cognitive deprivation, and death to patients.⁴ To date, there are no powerful diagnostic tools for early diagnosis or treatments able to efficiently inhibit the amyloid fibrillation, but this is considered one of the most promising ways to fight AD.^{3,5,6}

Amyloid- β fibrils are made by two β -sheets forming a U-shape monomer which is stabilized by a salt bridge between residue D23 and residue K28, which correspond to aspartic acid and lysine, respectively.⁷⁻⁹ The protofibril is made by parallel β -strands where the two β -sheets, called β -1 and β -2, are perpendicular to the fibril axis, and adjacent monomers are stabilized by hydrogen bonds.⁷ It is now recognized that amyloid- β fibrils grow in two distinct ways.^{1,10} The addition of $A\beta$ monomers to the ends of the fibril along the fibril axis produces fibril elongation, whereas the lateral binding of two fibrils along the fibril axis brings about the formation of the protofilament.¹¹

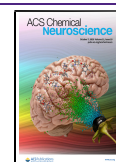
The contact between the two fibrils generally occurs through the β -strands with the β -2 β -sheets exposing the other β -strand to the environment.⁷ However, recent studies have shown other possible lateral aggregation processes involving three-folded fibrils¹² which yield several polymorphs, making the understanding of the fibrillation process more complex.¹³⁻¹⁵

Several works have demonstrated that the fibrillation process can be accelerated or retarded by the presence of nanoparticles.¹⁶⁻¹⁸ Recently, Liao et al.¹⁹ studied how 30-nm-diameter negatively charged gold nanoparticles (AuNPs) interact with $A\beta$ fibrils finding that AuNPs bind preferentially to mature fibrils; they proposed a mechanism where AuNPs can serve as nanochaperones for the inhibition of $A\beta$ fibrillation. In a recent work, Gao et al.²⁰ found that 36- and 18-nm-diameter AuNPs covered by L-glutathione accelerate the growth of $A\beta$ fibrils, while 6-nm-diameter AuNPs have the opposite trend, making them good candidates for developing new anti-AD drugs. The same research group interestingly showed how small Au nanoclusters covered with Cys-Arg dipeptides are able to completely dissolve mature fibrils into monomers.²¹ Moreover, NPs can act as specific probes for the diagnosis of amyloidosis as recently pointed out by several studies: Cendrowska et al.²² used 11-mercapto-1-undecanesulfonate (MUS)-coated AuNPs to efficiently assess the morphological polymorphism of different amyloidogenic proteins, such as $A\beta$ fibrils and α -synuclein, and other types of Au nanoparticles with mercaptoundecanoic sulfonate as the capping ligand²³ or citrate-capped AuNPs by Elbassal et al.²⁴ or as shown by Pansieri et al.²⁵ using functionalized gadolinium

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NPs (GdNP) have also been used. Moreover, the recent work of Cendrowska et al.²² showed that covering the AuNP only with MUS ligands can bind to A β fibrils but in a random manner, while the addition of hydrophobic 1-octanethiol (OT) to MUS in a ratio of 4:1 increases the hydrophobic contacts with the fibrils without altering the AuNP solubility.

More broadly, understanding the interaction of AuNPs with biological objects has become of primary importance in nanoscience and in nanotechnological applications.^{26–30} AuNPs size and surface composition is a key factor in determining the interaction with proteins^{31–36} and with biological membranes,^{37–42} but a complete description of these interactions is still missing due to the high number of variables involved. A recent experimental and computational study by Brancolini et al.⁴³ has provided an explanation of the interaction between 5-nm-diameter citrate-capped AuNPs and the fibrillogenic protein β -2 microglobulin. Their results have suggested that the AuNP-protein interactions and protein orientation upon binding are mainly driven by electrostatic interactions due to the presence of citrates covering the AuNP surface. Moreover, citrate-capped AuNPs do not induce protein fibrillation but could affect His31 amino acid which is involved in the protein destabilization toward an amyloidogenic intermediate.⁴³ In a recent computational work of Bellucci et al.,⁴⁴ it has been shown that a bare Au(111) flat surface can inhibit the fiberlike conformation of an amyloid fibrillar (16–22) peptide. The same authors have demonstrated that the interaction of a single length A β _{1–42} peptide with a Au(111) flat surface increases the fibrillar structures due to the high number of contacts that the gold slab flat geometry imposes.⁴⁴

The aim of this study is to elucidate how monolayer-coated AuNPs can act both as markers for amyloid- β fibrils polymorphisms, as recently shown,²² but also as possible drug carriers to specific fibril regions. For this purpose, we employed that molecular dynamics simulations are the best tools to have an in-depth view at the molecular level of the complex mechanisms that regulates the adsorption of AuNPs over amyloid- β fibrils.

RESULTS AND DISCUSSION

To elucidate the interaction of monolayer-coated AuNPs with both A β (1–42) and A β (1–40) fibrils, we simulated monolayer-coated AuNPs with a core diameter of 2 and 5 nm interacting with a nonmature protofibril, by means of atomistic molecular dynamics (MD) simulations. Monolayer-coated AuNPs were built according to the previous work of Van Lehn et al.,³⁸ see Figure 1, changing the monolayer composition and the core diameter, as reported in Methods according to the work of Cendrowska et al.²² Two sizes of the core AuNP were chosen as 2 and 5 nm in order to have a comparison between different NP sizes. For the 2-nm AuNP, two coatings were studied in order to understand how the coating affects the binding to amyloid fibrils: only MUS and MUS:OT with a ratio of 70:30. As shown in our previous study,²² these coatings were shown to be highly efficient in labeling the A β (1–40) polymorphisms, whereas higher concentrations of OT reduce NP solubility. The A β (1–40) protofibril structure is retrieved from the work of Petkova et al.⁸ and has been used in our recent studies,^{22,45,46} and the A β (1–42) protofibril structure is retrieved from the work of Lührs et al.,⁷ see Figure 1. The system is placed in a cubic box with the same height of the protofibril, and periodic boundary

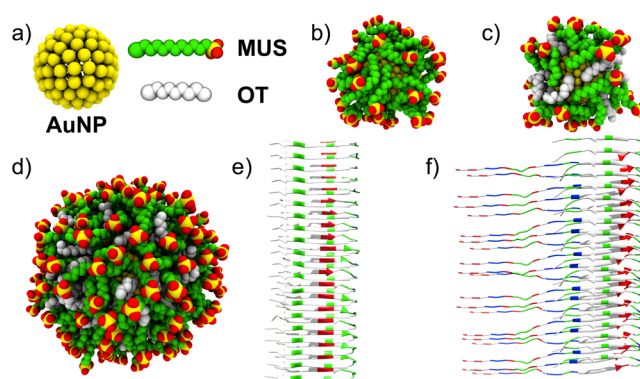


Figure 1. a) Representation of the bare 2-nm AuNP and of its hydrophilic 11-mercapto-1-undecanesulfonate (MUS) and hydrophobic 1-octanethiol (OT) ligands. In panels b) and c) 2-nm-diameter AuNPs are covered with all MUS and 70%MUS-30%OT, respectively, while in panel d) a 5-nm-diameter 70%MUS-30%OT AuNP is shown. MUS ligands are colored green with the heads colored yellow (sulfur) and red (oxygen), while OT ligands are colored white. In panels e) and f) the structures of A β (1–42) and A β (1–40), side view. Periodic boundary conditions are not shown for clarity. Protofibrils are colored according to amino acid hydrophobicity and charge (hydrophobic in white, hydrophilic in green, positively charged in blue, and negatively charged in red).

conditions are applied allowing the interaction of the fibril endings with their images at the boundaries in order to obtain a continuous indefinitely long protofibril as previously done by Buchete et al.⁴⁷

For each MD run, the protofibril is placed in the center of the simulation box, while one AuNP is randomly displaced, making sure that they are not in contact with each other. The spontaneous binding of many different kinds of monolayer-coated AuNPs to A β (1–40) and to A β (1–42) fibrils is observed during the simulation runs both by visual inspection and by the number of contacts of the AuNP with the fibrils, as reported in Figure S.3. In the case of the A β (1–42) fibril, we found that, whatever coated the 2-nm AuNPs interacts directly with the side of the protofibril in correspondence to the elbow (amino-acid sequence: ²⁷NKGAI³¹) which links the two β -sheets, and it is characterized by the presence of both hydrophobic and hydrophilic amino acids. At the beginning of the MD simulation, the interaction is given by the contact of ligands covering the AuNP with hydrophilic amino acids located near the head of the beta-1 β -sheet, and then after 20 ns, the AuNP moves toward the region with hydrophobic amino acids closer to the tail of the beta-2 region, see Figure 2a and 2b. This behavior is found for all kinds of 2-nm AuNPs, and we called this binding site “elbow binding”. This configuration is characterized by a persistent interaction for the rest of the simulation (as shown in Figure S.3) of the AuNPs with Gly29, Ala30, and Ile31 amino acids, suggesting that this is a possible stable binding site.

In addition, a second binding site (named “ β -2 binding”) located on the β -2 β -sheet (amino-acid sequence: ³¹IIGLMV-GGVVI⁴¹) is observed, see Figure 2c and 2d. In this case, the AuNPs interact at first with the region between the elbow and the β -2 β -sheet, and after 10 ns, the AuNP moves along the β -sheet. Amino acids involved in the binding have their side chain pointed outward, and they are Ile31, Gly33, Met35, Gly37, Val39, and Ile41. Also, in this case, all AuNPs remain bound to the β -sheet for the remainder of the simulation time.

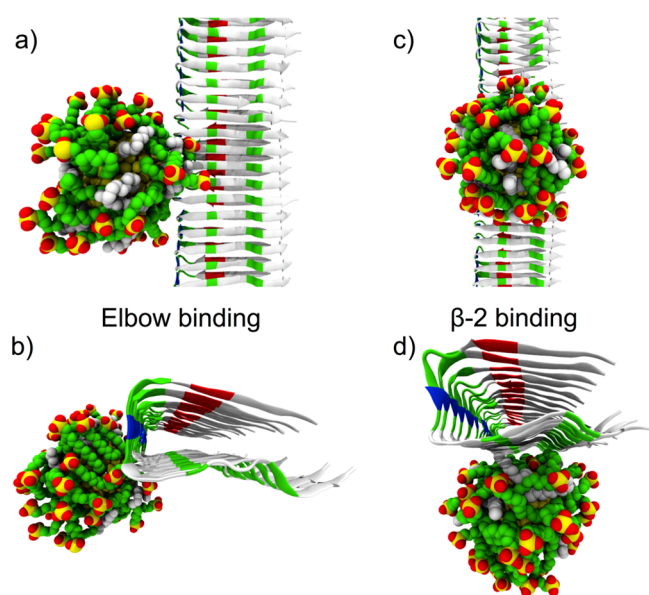


Figure 2. In a) and b) the elbow binding of the 2-nm 70%MUS-30% OT AuNP on the protofibril, while in c) and d) the β -2 binding as seen from the top and front of the fibril. Only the secondary structure of the protofibril is represented for clarity. Amino acids are colored according to their hydrophobicity and their net charge: hydrophobic amino acids are represented in white, hydrophilic amino acids are represented in green, positively charged amino acids are represented in blue, and negatively charged amino acids are represented in red. Heads of MUS ligands are colored according to the atom type: sulfur in yellow and oxygen in red.

Both binding modalities are supported by the recent results of Cendrowska et al.²² where they showed that coated AuNPs can be used to label the edge of different amyloidogenic proteins, such as $A\beta(1-40)$ fibrils.

The 5-nm-diameter AuNP is found to bind with the $A\beta(1-42)$ protofibril over the 100 ns simulations only in the elbow region, while it is never found to interact with β -sheet regions suggesting the presence of a possible potential barrier that could, in principle, be overcome by using longer time scales that are not affordable with full atomistic simulations.

For simulations of $A\beta(1-40)$, the 2- and 5-nm AuNPs interact with the beta-1 region of the protofibril (" β -1 binding"), making stable contacts with the amino acids from His14 to Phe20. During the simulations involving the 70/30 2-nm AuNP, we observed that amino acids in the $A\beta(1-40)$ tails interact with the AuNP before its binding to the fibril, see Figure 3a. In this case, up to 4 tails grab the AuNP especially through Ala2 and Phe4 amino acids establishing hydrophobic interactions. In the simulation with the 2-nm allMUS AuNP, an $A\beta(1-40)$ tail seems to mediate the interaction with the AuNP driving the binding to the beta-1 region. The first interaction happens through a MUS ligand and residues Arg5 and His6 that grab the tail of the MUS ligand, see Figure 3b, and then the AuNP is close enough to the protofibril to interact with the beta-1 region to form a stable contact.

The 5-nm AuNP spontaneously binds to the β -1 region where the adsorption is mediated by a tail that makes the first binding as for the 2-nm AuNP case, but it is not able to grab the AuNP due to its size. In this case, the AuNP adsorbs over the fibril, but coated ligands cannot be accommodated into the protofibril shape because they are closely packed together.

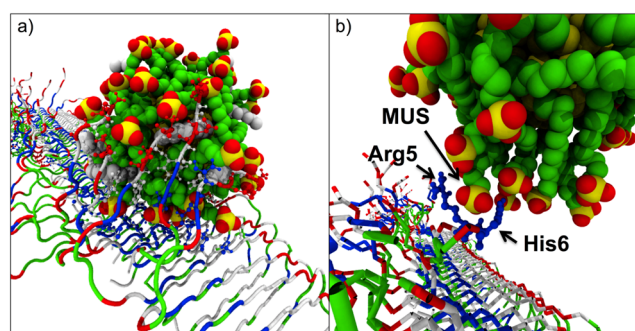


Figure 3. In panel a) a snapshot of the simulation of the 70/30 AuNP bound to the beta-1 region of the $A\beta(1-40)$ protofibril grabbed by 5 tails. In panel b) are shown an arginine (RS) and a histidine (H6) grabbing the head of a MUS ligand in the early steps of the binding of all the MUS AuNP with the $A\beta(1-40)$ fibril. Amino acids are colored according to their hydrophobicity and their net charge: hydrophobic amino acids are represented in white, hydrophilic amino acids are represented in green, positively charged amino acids are represented in blue, and negatively charged amino acids are represented in red. Heads of MUS ligands are colored according to the atom type: sulfur in yellow and oxygen in red.

In all simulations, the protofibril secondary structure shows no changes in the β -sheets and in the elbow regions. Small conformational changes are found only in the highly mobile tails close to the N-terminal region, as recently found.⁴⁵

Computational and experimental studies on the $A\beta$ fibrils have highlighted the presence of several binding sites mainly located in proximity to the two β -sheets comprising amino acids Leu17 - Ala21 and Gly33 - Val40.^{48,49} Chalifour et al.⁵⁰ used circular dichroism and electron microscopy to show that the stretch of residues 16–20 on $A\beta(1-40)$ fibrils acts as a possible receptor for peptides to prevent amyloid fibrillation. The (¹⁶KLVFFA²¹) motif has also been studied as possible binding sites for antifibrillation curcumin-like drugs by using molecular docking and MD simulations⁵¹ and by UV-visible spectroscopy and fluorescence quenching studies.⁵² The results of molecular docking by Chen et al.⁵³ have shown three main interaction sites for the binding of peptides to $A\beta(1-40)$: they comprise amino acids 28–32 and amino acids 11–19 and 34–40.

The binding site found in the present work for $A\beta(1-40)$ spans His14 to Phe20 (¹⁴HQKLVFFA²¹) in agreement with the predicted binding site (¹⁶KLVFFA²¹) for drugs and peptides reported in the literature by several studies.^{51,52,54,55}

The His14 to Phe20 region, characterized by a β -sheet folding, is thought to be responsible for the secondary nucleation process, i.e., the lateral aggregation of amyloid monomers onto preformed fibrils that bring about the formation of mature fibrils.⁵⁶ The AuNPs interacting with the $A\beta(1-40)$ in this specific region can act as a spacer disturbing the binding of additional fibrils and, in principle, can inhibit or retard the secondary nucleation process.

Table 1 lists a number of descriptors, computed on 100 ns simulation runs after binding, considered to characterize the interactions between the AuNPs and the $A\beta$ fibrils.

Analysis of the data values shows that

- 1) In the case of $A\beta(1-42)$, the number of contacts between the AuNP monolayer and the protofibril is higher in the β -2 binding for all AuNP compositions with respect to the elbow binding.

Table 1. Number of Contacts, RMSD of the Fibril after the Binding, and DG_{phobic} Calculated for the Different AuNP Monolayer Compositions and Diameters Interacting with the $A\beta(1-42)$ and with the $A\beta(1-40)$

	binding site	2 nm ^a 70/30 ^b	2 nm ^a 100/0 ^b	5 nm ^a 70/30 ^b
<i>Aβ(1-42)</i>				
no. of contacts	elbow	140 ± 10	135 ± 10	145 ± 15
	β -2	180 ± 15	180 ± 16	195 ± 25
RMSD (nm)	elbow	0.48 ± 0.02	0.54 ± 0.04	0.32 ± 0.02
	β -2	0.42 ± 0.03	0.46 ± 0.03	0.33 ± 0.01
DG_{phobic} (kcal/mol)	elbow	-128 ± 47	-169 ± 47	-99 ± 94
	β -2	-139 ± 52	-184 ± 52	-174 ± 94
<i>Aβ(1-40)</i>				
no. of contacts	β -1	220 ± 15	180 ± 20	120 ± 15
	β -1	0.49 ± 0.02	0.54 ± 0.03	0.34 ± 0.01
RMSD (nm)	β -1	0.49 ± 0.02	0.54 ± 0.03	0.34 ± 0.01
	β -1	-197 ± 56	-179 ± 47	-202 ± 80
DG_{phobic} (kcal/mol)	β -1	-197 ± 56	-179 ± 47	-202 ± 80

^aAuNP diameter. ^bMonolayer composition.

- All the AuNPs establish a similar number of contacts with the β -2 region of the $A\beta(1-42)$ protofibril, whereas in the case of the $A\beta(1-40)$ protofibril, a higher number of contacts is observed for the 70/30 AuNP (2 nm) due to the interaction with the protofibril's tails.
- Overall, the stability of the binding, as highlighted by the RMSD, seems to be slightly lower for the 2-nm AuNPs studied with respect to the 5-nm AuNP.
- The estimation of the hydrophobic component of the DG energy (DG_{phobic}), see the SI, shows that the β -2 binding mode is always more stable than the elbow one, and the stability increases with the number of MUS ligands on the monolayer. The DG_{phobic} of the β -2 binding mode of the 5-nm AuNP to the $A\beta(1-42)$ protofibril is double with respect to the elbow binding mode, in agreement with our observation made by the visual analysis of the trajectory that the ligands do not fit the protofibril structure.

To gain deeper insight into the β -sheet and elbow binding sites in the fibrils, we computed the potential of mean force (PMF) using the Umbrella sampling methodology, as reported in the SI. We found that the binding energies are fibril dependent and are modulated by both the coating chemistry and the size of the AuNPs. For the $A\beta(1-42)$ fibril, the β -2 binding energies are about 10 kcal/mol more stable than the elbow binding energies for the 2-nm AuNPs, see Table 2, whereas the binding energies for the 5-nm AuNP are similar in both regions. However, a potential barrier of 3.5 kcal/mol is observed for the binding of the 5-nm AuNP to the β -2 region, as reported in Table 2. This barrier is due to the presence of water molecules located in the cavity of the β -2 region that screen the interactions between the 5-nm AuNP and this particular portion of the fibril, preventing spontaneous binding, as shown in Figure S.4. In this case, ligands trap water molecules in the channel given by I31 to G37 due to the bigger size of the AuNP, while the 2-nm AuNPs are sharper and can easily displace water molecules. Values of the PMF for the $A\beta(1-40)$ protofibril show that the allMUS 2-nm AuNP establishes more stable interactions than the other kind of AuNPs bound to the β -1, with energy values similar to those obtained for the β -2 binding in the $A\beta(1-42)$. On the

Table 2. Binding Energies, Potential Barriers, and Forces for Different Monolayer Compositions for the 2- and 5-nm-Diameter AuNPs Expressed in kcal/mol and Centers of Mass (CoM) Distances Expressed in nm^a

	binding site	2 nm 70/30	2 nm 100/0	5 nm 70/30	
<i>Aβ(1-42)</i>	elbow	binding energy	-55	-45	-23
		CoM distance	2.25	2.25	4.24
		potential barrier			
	β -2	force (kJ/mol)	218.86	239.73	96.86
		binding energy	-65	-54	-29
		CoM distance	3.15	3.15	4.94
<i>Aβ(1-40)</i>	β -1	potential barrier			3.5
		force (kJ/mol)	282.26	257.52	239.03
		binding energy	-24	-51	-38
	β -1	CoM distance	3.55	3.50	4.65
		potential barrier			
		force (kJ/mol)	219.7	170.43	184.99

^aBinding energy values are computed at the distance between the CoM of the AuNP and the protofibril reported below. The force values correspond to the maximum value of the derivative of the Morse potential fitted over the binding energy values reported in the SI.

contrary, the 70/30 2-nm AuNP establishes most stable interactions with $A\beta(1-40)$. This difference could be explained by the differences in the amino-acid composition of the two β -sheets of the two fibrils: in the $A\beta(1-40)$, the β 1 given by the sequence ¹⁵QKLFFFAEDV²⁴, which contains charged amino acids, and the β 1 given by the sequence ³⁰AIIGLMVGGV⁴⁰, which is mainly hydrophobic. It is important to note that the total free energy of binding is much lower in magnitude compared to DG_{phobic} , which implies that upon binding there is a strong entropic penalty presumably stemming from the ligand rearrangements. To put it in perspective, these binding free energies are much smaller than those for the same nanoparticles and lipid bilayers.³⁸ Moreover, the forces calculated for each nanoparticle in the case of $A\beta(1-42)$ fibrils decrease with the binding energy, while an opposite trend is observed for $A\beta(1-40)$ fibrils where higher energies are related to low forces, as reported in Figure 4 and in Table 2.

In order to assess the average number of AuNPs able to bind to a fibril per unit length, we have estimated the closest distance at which two AuNPs can bind on the same binding site by computing the distance, d_{CoM} , at which the electrostatic repulsion, $E_{\text{repulsion}}(d_{\text{CoM}})$, is equal to the absolute value of the binding energy, E_{binding} , on that site, as reported in eq 1. Details of the computations are reported in the SI.

$$E_{\text{repulsion}}(d_{\text{CoM}}) = |E_{\text{binding}}| \quad (1)$$

The minimum distance is mainly governed by the net charge of the AuNP. Thus, the 70/30 2-nm AuNP can reach a shorter separation with respect to 5-nm AuNPs that has a higher net charge due to the increased number of MUS ligands, see Table 3. For the $A\beta(1-40)$, the 2-nm AuNPs can reach the same

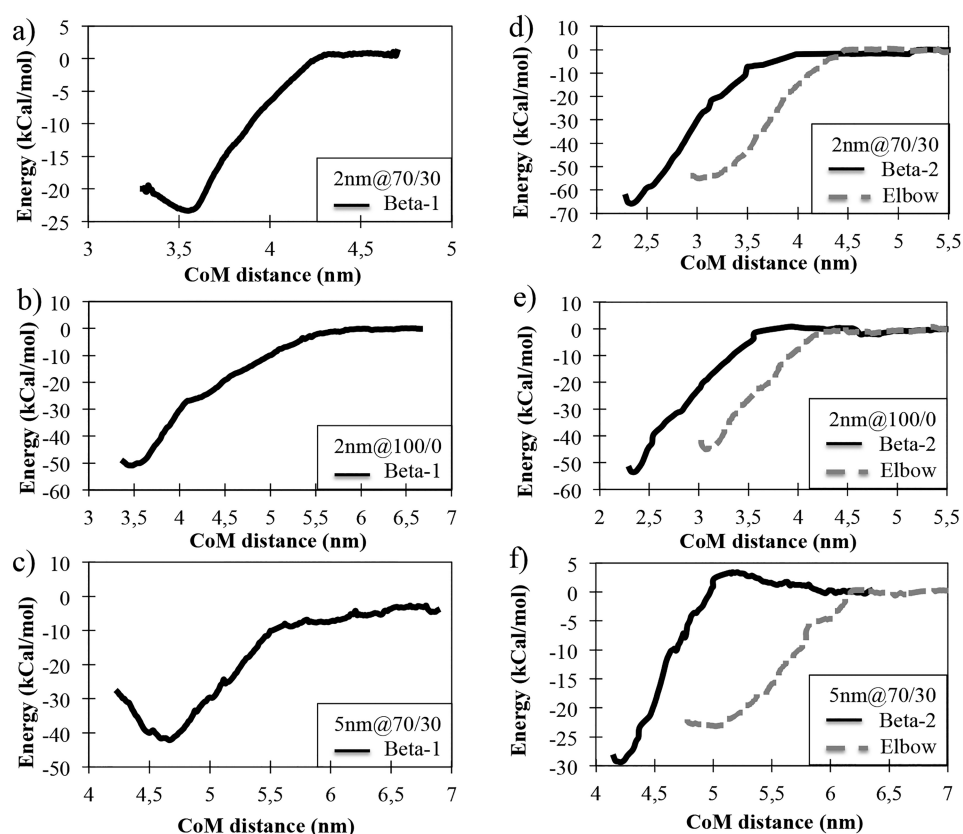


Figure 4. Potential of mean force expressed in kcal/mol versus the distance between the centers of mass of the AuNP and the fibril. In panels a)–c) is shown the PMF for $A\beta(1-40)$ fibrils, while in panels d)–f) the black continuous line represents the front binding, and the gray dashed line represents the side binding for $A\beta(1-42)$ fibrils.

Table 3. Minimum Separation Distance, d_{CoM} (in nm), between Two AuNPs When the Electrostatic Repulsion Is Equal to the Absolute Value of the Binding Energy

	binding site	70/30 2 nm	100/0 2 nm	70/30 5 nm
$A\beta(1-42)$	elbow	4.59	4.83	5.86
	β -2	4.54	4.77	5.79
$A\beta(1-40)$	β -1	4.80	4.79	5.71

minimum distance because the repulsive charge effect is balanced by the binding energy difference. The 2-nm 70/30 NPs bound to the $A\beta(1-42)$ can reach the smaller distances due to the high binding energy. These calculations do not take into account the possible effects at the short-range scale that can affect the AuNPs aggregation as reported in a previous computational work by Van Lehn et al.⁵⁷

In summary, we have shown that small monolayer-protected AuNPs are able to bind to both $A\beta(1-40)$ and to $A\beta(1-42)$ without altering the protein secondary structures. For all three kinds of AuNPs considered, the binding happens on the external protofibril regions characterized by the presence of two β -sheets made by hydrophobic amino acids and in correspondence to residues that are responsible for fibril aggregation. Importantly, the binding of AuNPs with the $A\beta(1-40)$ is mediated by the protofibril tails that drive the interaction to the β -1 β -sheet. These results clearly show the potential of gold nanoparticles to both inhibit the fibrillation process, in particular the 2-nm MUS:OT 70:30 coated AuNPs efficiently target the $A\beta(1-42)$ fibrils, and to act as possible carriers for drugs to fight Alzheimer's disease.

METHODS

Molecular Dynamics Simulations. Molecular dynamics simulations were performed to simulate the interaction of a gold NP with the amyloid- β ($A\beta$) protofibril in physiological conditions. $A\beta(1-40)$ and $A\beta(1-42)$ have a similar secondary structure, and they differ in their amino acid sequence only in the last two residues ($A\beta(1-40)$ FASTA sequence: DAEFRHDSGYEVHHQKLVFFAEDVGSNKGAIIGLMVGGVVIA;⁸ $A\beta(1-42)$ FASTA sequence: DAEFRHDSGYEVHHQKLVFFAEDVGSNKGAIIGLMVGGVV⁷).

The $A\beta(1-40)$ protofibril structure was obtained from the previous work of Petkova et al.⁸ (PDB ID: 2LMN), while the $A\beta(1-42)$ protofibril structure was obtained from the work of Lührs et al.⁷ (PDB ID: 2BEG). Both structures were already used in previous computational studies with good results.^{58–60} The $A\beta(1-42)$ and the $A\beta(1-40)$ fibrils were built replicating the reference structure 4 times along its principal axis obtaining a continuous structure 9.805 nm long made by 20 monomers. An acetyl group was added to cap each N-terminus chain in order to mimic missing amino acids forming the peptide, whereas deprotonated C-terminus were used, according to the work of Lemkul et al.⁵⁹ The first 8 missing amino acids of $A\beta(1-40)$ were inserted using the Molefacture plugin in the VMD package⁶¹ as random coils as predicted by both the Jpred web server⁶² and by the Modeler package⁶³ for protein secondary structure assignments, as previously done.^{45,46} The same procedure is not suitable for the $A\beta(1-42)$ structure due to the high number of missing amino acids and to the consequent inability to accurately simulate the fibril.

The protofibril was placed in an orthorhombic box with the same height of the fibril. The protofibril in the box interacts with its images at the top and at the bottom of the box forming a continuous structure along the z direction.

The 2- and 5-nm-diameter AuNPs were built according to the work of Van Lehn et al.⁶⁴ The gold core is hollow, and missing gold atoms

masses are redistributed uniformly to shell atoms. Hydrophilic 11-mercapto-1-undecanesulfonate (MUS) and hydrophobic 1-octanethiol (OT) ligands were grafted to the AuNP surface via their sulfur atoms. Van Lehn et al.⁶⁴ showed that AuNP surface structural characteristics are not affected by different ligand morphologies but only by the NP size and ligands relative lengths. In this study, we used a random morphology. Three 2-nm-diameter AuNPs were coated with two different ligand compositions: a) 70%MUS-30%OT and b) 100%MUS-0%OT. In the text of the article, these AuNPs are labeled with their composition (70/30 and allMUS) for brevity. The 5-nm-diameter AuNP is covered by 70%MUS-30%OT. The overall charge of the AuNP is given by the number of MUS ligands forming the protecting monolayer.

For all simulations, the GROMOS 54a7 united atom force field⁶⁵ modified by Van Lehn et al.⁶⁴ to include potentials for ligands was used to model both the protofibril and the AuNP.^{64–66} Simple point charge (SPC) water⁶⁷ was added, and water molecules inside the hollow gold core were removed. A salt concentration of 150 mM was used, and the system was neutralized with the use of counterions.

Electrostatics interactions^{68,69} were computed by the particle-mesh Ewald (PME) algorithm, using a fourth-order cubic interpolation, a grid spacing of 0.16 nm, and a real-space cutoff of 1 nm, as described by Van Lehn et al.⁶⁴ Both van der Waals and neighbor list cutoffs for short-range interactions were set to 1.0 nm. The temperature was kept constant at 310 K, and the pressure was set to 1 bar in order to mimic physiological conditions. The temperature was controlled using a velocity-rescaling thermostat with a coupling time of 0.1 ps. During the equilibration run, the pressure was controlled by the Berendsen barostat, while during the production run, the pressure was controlled by the Parrinello-Rhman barostat with a coupling time of 2 ps and an isothermal compressibility of $4.5 \times 10^{-5} \text{ bar}^{-1}$. All simulations were 100 ns long, and the time step used was 2.0 fs.

For each simulation, the protofibril was placed at the center of the simulation box with one AuNP randomly positioned making sure that they are not in contact. The number of water molecules in each simulation is slightly different due to the AuNP embedding process. For each different AuNP composition and diameter, three simulations of 100 ns with different starting configurations were performed. All simulations and data analysis were performed using the Gromacs-5.0.4 package.⁷⁰

Data Analysis. Data analysis was performed using the Gromacs package.⁷⁰ The root mean square displacement (RMSD) was calculated for the coated AuNP after the binding to the fibril. The RMSD calculations give a measure of the stability of the AuNP after the binding.

The change in the free energy (DG_{phobic}) was obtained explicitly as the DSASA multiplied by the constant γ which is the parameter controlling the magnitude of the hydrophobic driving force. The value of γ is 4.7 kcal/mol according to previous works of Van Lehn et al.^{71,72} and of Sharp et al.⁷³ The SASA is a measure of the hydrophobic material exposed to the solvent at each simulation time step and was calculated by the Shrake-Rupley “rolling ball” algorithm⁷⁴ by the use of 100 uniformly distributed mesh points per hydrophobic bead and a 0.14-nm probe size to reproduce water solvation.

The number of contacts between the polymer monolayer and the fibrils during the simulation time is given by the number of atoms of the monolayer that have a distance less than 0.5 nm from any one atom of the fibril.

All average values and errors have been computed by averaging data through the simulation length using the Gromacs tools.⁷⁰

■ ASSOCIATED CONTENT

Supporting Information

The Supporting Information is available free of charge at <https://pubs.acs.org/doi/10.1021/acschemneuro.0c00497>.

Simulation details, potential of mean force calculation, secondary structure assignment, and electrostatic repulsion expression (PDF)

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Author Contributions

A.A.-K. designed the research and models. F.T. performed the simulations and data analysis. A.A.-K. and F.T. discussed the results and interpretation. The manuscript was written through contributions of all authors. All authors have given approval to the final version of the manuscript.

Notes

The authors declare no competing financial interest.

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