

# Carbon Nanotube Inhibits the Formation of $\beta$ -Sheet-Rich Oligomers of the Alzheimer's Amyloid- $\beta$ (16-22) Peptide

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**ABSTRACT** Alzheimer's disease is associated with the abnormal self-assembly of the amyloid- $\beta$  ( $A\beta$ ) peptide into toxic  $\beta$ -rich aggregates. Experimental studies have shown that hydrophobic nanoparticles retard  $A\beta$  fibrillation by slowing down the nucleation process; however, the effects of nanoparticles on  $A\beta$  oligomeric structures remain elusive. In this study, we investigate the conformations of  $A\beta$ (16-22) octamers in the absence and presence of a single-walled carbon nanotube (SWCNT) by performing extensive all-atom replica exchange molecular-dynamics simulations in explicit solvent. Our simulations starting from eight random chains demonstrate that the addition of SWCNT into  $A\beta$ (16-22) solution prevents  $\beta$ -sheet formation. Simulation starting from a prefibrillar  $\beta$ -sheet octamer shows that SWCNT destabilizes the  $\beta$ -sheet structure. A detailed analysis of the  $A\beta$ (16-22)/SWCNT/water interactions reveals that both the inhibition of  $\beta$ -sheet formation and the destabilization of prefibrillar  $\beta$ -sheets by SWCNT result from the same physical forces: hydrophobic and  $\pi$ -stacking interactions (with the latter playing a more important role). By analyzing the stacking patterns between the Phe aromatic rings and the SWCNT carbon rings, we find that short ring-centroid distances mostly favor parallel orientation, whereas large distances allow all other orientations to be populated. Overall, our computational study provides evidence that SWCNT is likely to inhibit  $A\beta$ (16-22) and full-length  $A\beta$  fibrillation.

## INTRODUCTION

Alzheimer's disease (AD) is characterized by amyloid deposits predominantly composed of the 40- to 42-residue-long amyloid- $\beta$  peptides ( $A\beta$ 40/ $A\beta$ 42) (1). X-ray diffraction data show that these deposits consist of fibrils that display a cross- $\beta$  structure with the  $\beta$ -strands perpendicular and the interstrand hydrogen bonds (H-bonds) parallel to the fibril axis (2). In vitro fibrillation of  $A\beta$  is described by a nucleation-elongation process characterized by a lag phase associated with the formation of a critical nucleus, after which fibril growth proceeds rapidly (3). Before nucleation occurs,  $A\beta$  can form a variety of metastable intermediate oligomeric states with different association numbers and structures, such as small oligomers,  $A\beta$ -derived diffusible ligands (ADDLs), and protofibrils with increasing  $\beta$ -sheet structure (4,5).

Although the molecular mechanism of AD pathogenesis remains elusive, there is increasing experimental evidence that the key pathological species are transient  $\beta$ -rich oligomers, which therefore represent therapeutic targets for treatment of AD (5,6). The goal of preventing  $A\beta$   $\beta$ -sheet formation by means of peptide-based inhibitors (7), small molecules (8), or proteins (9) has been pursued for many years and is still a very active field of research. However, investigators have not yet been able to use the proteins designed in these studies to construct therapeutic agents against AD, in part because of the problem of blood-brain barrier permeability (10). Recently, a new class of agents

emerged from the observation that the binding of proteins to nanoparticle surfaces affects protein folding and aggregation (11,12). Experimental studies indicate that fullerene (13), carbon nanotubes (14,15), and polymeric (16) and fluorinated nanoparticles (17) inhibit/promote amyloid formation depending on their surface physicochemical properties by increasing/decreasing the lag phase time for nucleation, but they all leave the elongation phase invariant, suggesting a surface-modulated nucleation mechanism (15,16). There is strong evidence that the protein's intrinsic stability also affects the surface-mediated nucleation process. For example, Linse et al. (15) demonstrated that hydrophobic (HP) copolymeric NiPAM:BAM nanoparticles accelerate the fibrillation of the  $\beta$ 2-microglobulin protein, which is  $\beta$ -sheet-rich in its native form, whereas they retard the fibrillation of  $A\beta$ 40 (16), an intrinsically disordered peptide. Based on fibrillation kinetics experiments, Linse et al. suggested that binding of monomeric  $A\beta$ 40 and prefibrillar oligomers to the nanoparticle surfaces prevents fibrillation. Despite these observations, however, details about the  $A\beta$ -nanoparticle interaction and the structures of the oligomeric species pre-nucleation remain to be determined. Such knowledge is important for elucidating the effects of HP nanoparticles on  $A\beta$  aggregation.

Single-walled carbon nanotubes (SWCNTs) are HP, tubular nanostructures with diameters of only 0.4–3.5 nm. They can easily enter into the cytoplasm and nucleus through the lipid bilayer (18,19). No short-term (20) or long-term (21) cytotoxicity of SWCNTs has been reported. These contradictory toxic effects clearly need to be clarified and

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understood. As a first step toward understanding the effects of HP nanoparticles on the low-molecular-weight aggregates of A $\beta$ , we studied an SWCNT and an octamer of the 16-22 fragment of A $\beta$ , A $\beta$ (16-22) as a model system. Our choice of an octamer was motivated by recent all-atom molecular-dynamics (MD) studies indicating that the minimum nucleus size consists of at least eight A $\beta$ (16-22) peptides based on the stability of preformed  $\beta$ -sheet assemblies (22,23). Our choice of the A $\beta$ (16-22) peptide was based on the following factors: First, computational determination of all-atom A $\beta$  monomeric equilibrium structures is feasible in explicit solvent (24), but one is faced with a convergence issue for all-atom dimers to pentamers (25,26). In contrast, the length of A $\beta$ (16-22) (seven amino acids) enables the computational study of all-atom octamers at equilibrium in the presence of an SWCNT in explicit solvent. Second, A $\beta$ (16-22) peptide, which includes the central HP core, CHC (LVFFA), is recognized as being essential for A $\beta$  fibrillation (27,28) and also forms amyloid fibrils with antiparallel  $\beta$ -strands in isolation (29). Third, the KLVFF motif is a primary target in the search for aggregation inhibitors for AD therapeutics (30,31). Finally, investigators have examined the dynamics and thermodynamics of A $\beta$ (16-22) oligomerization without nanoparticles using coarse-grained (CG, up to 8-mer) (32,33) and all-atom (up to 6-mer) simulations (34–36) starting from random conformations or preformed  $\beta$ -sheets, thus providing structural information for comparison.

Although recent computational studies have focused on the aggregation of amyloid peptides in the presence of nanoparticles using a CG nanoparticle model (37) or implicit/explicit lipid models (38–40), to our knowledge, this is the first computational study to investigate the structures, thermodynamics, and interactions of eight A $\beta$ (16-22) chains with an SWCNT using all-atom replica exchange MD simulations (REMD) in explicit solvent. We performed a total of three independent REMD simulations starting from an amorphous A $\beta$ (16-22) octamer with/without SWCNT and a prefibrillar  $\beta$ -sheet octamer with SWCNT.

## MATERIALS AND METHODS

The A $\beta$ (16-22) peptide consists of seven residues (Ac-KLVFFAE-NH<sub>2</sub>) blocked by acetyl and amine groups as determined experimentally (29). To mimic the experimental neutral pH condition, the side chains of Lys and Glu are charged (Lys<sup>+</sup> and Glu<sup>-</sup>). Three REMD runs were performed on three different systems: random-A $\beta$ (16-22), random-A $\beta$ (16-22)+SWCNT, and sheet-A $\beta$ (16-22)+SWCNT. Each system was placed in a rectangular box of SPC water molecules (41) with a minimum distance to the water box wall of 0.9 nm. The total numbers of atoms for the three systems are 19,717, 19,663, and 18,682, respectively.

### Random-A $\beta$ (16-22)

The starting state of the A $\beta$ (16-22) octamer with random character for each chain, shown in Fig. 1 A, is the final conformation generated in a 14-ns MD simulation at 420 K in water starting from fully extended peptides.

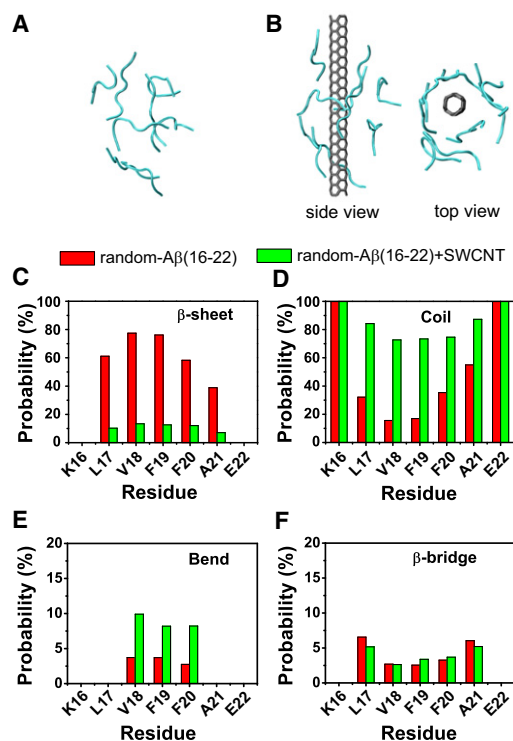


FIGURE 1 Calculated secondary structure probability of each residue in the REMD runs for random-A $\beta$ (16-22) and random-A $\beta$ (16-22)+SWCNT at 310 K for (C)  $\beta$ -sheet, (D) coil, (E) bend, and (F)  $\beta$ -bridge. The initial random states for the two runs are given in panels A and B. Two different views of the initial state for the random-A $\beta$ (16-22)+SWCNT run are shown in B.

### Random-A $\beta$ (16-22) + SWCNT complex

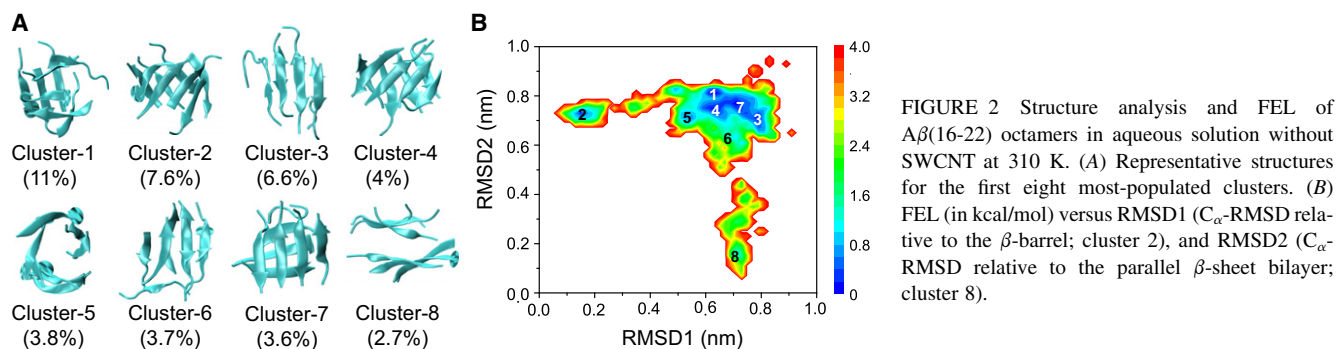
The initial state of the A $\beta$ (16-22) octamer in the complex is the same as in the A $\beta$ (16-22) system. An SWCNT with a diameter of 0.542 nm is placed at the center of eight peptide chains. Its length is set to 4.25 nm to provide a sufficient surface for the A $\beta$ (16-22) peptides to adsorb.

### Sheet-A $\beta$ (16-22) + SWCNT complex

This A $\beta$ (16-22)  $\beta$ -sheet bilayer is taken from cluster 8 in Fig. 2 A and an SWCNT is placed between the two sheets (see Fig. 5 A). The SWCNT is the same size as the one in the random-A $\beta$ (16-22)+SWCNT complex.

## REMD simulations

The REMD simulations are performed with the use of the GROMACS software package (42). In accordance with several computational studies of A $\beta$ (16-22) (43–45), the GROMOS96 43A1 force field (46) is used to describe intra- and intermolecular interactions. To avoid high-pressure artifacts at elevated temperature, and following the work of Seibert et al. (47), we carry out our REMD simulations in the NPT ensemble using 40 replicas, each of 110 ns duration, at temperatures exponentially spaced between 310 K and 420 K. The swap time between two neighboring replicas is 1 ps, which is large compared with the integrated autocorrelation time of the potential energy of the system at the lowest temperature 310 K (0.51 ps) (48,49) (see the Supporting Material). The acceptance ratio is ~17% (Fig. S1). To maintain the temperatures at the chosen values, velocity rescaling coupling method (50) is used with a coupling constant of 0.1 ps.



The pressure is kept at 1 bar with a coupling constant of 1 ps via Berendsen's method (51). Constraints are applied for bond lengths using the SETTLE algorithm (52) for water, and the LINCS algorithm (53) for the peptides and SWCNT. This allows an integration time step of 2 fs. The cutoff for van der Waals interactions is 1.4 nm. A reaction-field correction (with a cutoff of 1.4 nm) with dielectric permittivity  $\epsilon = 78$  is used for the long-range electrostatic interactions. The carbon atoms of SWCNT are uncharged in accordance with Hummer et al. (54), and the Lennard-Jones parameters for the peptide-SWCNT and water-SWCNT interactions are obtained using the Lorentz-Berthelot rule.

## Analysis

We perform the analysis using our in-house-developed codes and the GROMACS facilities. We discard the first 30 ns of each REMD to remove the bias of the initial states, except when mentioned otherwise. The structural properties of each system are therefore based on a total of 3.2  $\mu$ s.

We analyze the REMD trajectories using several parameters, including the secondary structure content (via the DSSP program) (55), the free-energy landscape (FEL), the percentage of various sizes of  $\beta$ -sheet, the connectivity length (CL), and the probability density function (PDF) of the angle between two neighboring strands in each  $\beta$ -sheet. A detailed description of these parameters is given in the [Supporting Material](#).

The A $\beta$ (16-22) octameric structures are clustered according to the method of Daura et al. (56) with a  $C_{\alpha}$  root mean-square deviation (RMSD) cutoff of 0.3 nm using residues L17-A21, with K16 and E22 excluded because of their high flexibilities. We calculate all of the  $C_{\alpha}$ -RMSDs by neglecting the chain identifier of each peptide (see the [Supporting Material](#) for the procedure used to calculate the chain-independent RMSD).

Finally, we probe the A $\beta$ (16-22)-SWCNT interactions in detail by determining the probability distribution of the minimum distance between the side chain of each residue and the SWCNT surface. We also analyze the  $\pi$ -stacking interactions between the peptides and the nanotube surface by calculating the PDF of the distance between the centroids of the Phe aromatic ring and its closest SWCNT carbon ring, and the PDF of the angle between the two rings. We calculate the interplanar angle by determining the angle between the surface normals of the two rings. All representations of the studied systems are drawn with the use of the VMD program (57).

## RESULTS

Before characterizing the 3D structures and the energy landscapes of the A $\beta$ (16-22) peptides with and without SWCNT at 310 K starting from an amorphous, random coil octamer, we verify the convergence of the two REMD simulations. To that end, we compare the probability distributions of end-to-end distance of all chains in a random-A $\beta$ (16-22) (Fig. S2 A) or random-A $\beta$ (16-22)+SWCNT (Fig. S2 B)

system using the 30–70 ns and 70–110 ns data. As can be seen in the figures, the distributions overlap very well when the two independent time intervals are used. It should be noted that the shapes of the probability distributions of the end-to-end distance in the two systems look similar, with a small difference between the full widths at half-maximum (FWHMs) and heights of the peak. The FWHMs and heights of the peaks are (0.23 nm, 12%) and (0.30 nm, 19%) without and with SWCNT, respectively. These data indicate that the peptide-SWCNT interactions slightly influence the global dimension of each chain for such a short peptide as A $\beta$ (16-22). We also calculate the  $\beta$ -sheet contents using the 30–70 ns and 70–110 ns data. The calculated  $\beta$ -sheet probabilities within the two time intervals are 42.1% and 47.0% for A $\beta$ (16-22) without SWCNT versus 7.8% and 8.1% with SWCNT. Overall, the differences in  $\beta$ -sheet content and end-to-end distance distribution within the two time intervals are <5% in magnitude, indicating that our REMD simulations for the two systems have reasonably converged.

## The presence of SWCNT significantly reduces $\beta$ -sheet content

We calculate the secondary structure ( $\beta$ -sheet, coil, bend,  $\beta$ -bridge, and  $\alpha$ -helix) probability of each residue at 310 K. From Fig. 1, C–F, one can see that the secondary structure content of each residue is strongly affected by SWCNT. Note that the helix content is negligible in both simulations (data not shown). The CHC region spanning L17–A21 has 39–75% probabilities to adopt  $\beta$ -sheet states (Fig. 1 C) in the A $\beta$ (16-22) system, with the highest probability of 75% for V18 and F19, versus 8–15% in A $\beta$ (16-22)+SWCNT complex. Alternatively, the coil percentage for CHC is much lower with SWCNT (18–55%) than without SWCNT (75–90%). The  $\beta$ -bridge percentage of the residues V18-F19-F20 is roughly the same (8%) in both systems (Fig. 1 E), and the residues V18-F19-F20 have similar bend signals (5% with SWCNT versus 9% without SWCNT (Fig. 1 F). Averaged over all conformations within 30–110 ns, the numbers of backbone H-bonds are 30 and 10 in the random-A $\beta$ (16-22) and random-A $\beta$ (16-22)+SWCNT

systems, respectively. Taken together, these results demonstrate that the presence of SWCNT significantly prevents  $\beta$ -sheet formation of A $\beta$ (16-22) peptides.

### A $\beta$ (16-22) peptides form various $\beta$ -sheet-rich octamers without SWCNT, and the presence of SWCNT shifts equilibrium toward random coil aggregates

To investigate the atomic structures of the peptides in the absence/presence of SWCNT, we perform a chain-independent RMSD-based cluster analysis using a total of 40,000 conformations for each replica. Using a  $C_{\alpha}$ -RMSD of 0.3 nm, we separate the octamers in random-A $\beta$ (16-22) and random-A $\beta$ (16-22)+SWCNT systems at 310 K (replica 1) into 166 and 136 clusters, respectively. The large number of clusters reflects the very high structural heterogeneity of the A $\beta$ (16-22) octamers at physiological temperature. As expected, the number of clusters increases with temperature (Fig. S3) and becomes  $>1000$  for  $T \geq 391.57$  K (replica index  $\geq 30$ ). The centers of the first eight most-populated clusters of A $\beta$ (16-22) octamers, and their populations with and without SWCNT at 310 K are respectively shown in Figs. 2 A and 3 A. These clusters represent 43.0% and 39.4% of all conformations in the absence and presence of SWCNT, respectively.

Without SWCNT, the clusters in Fig. 2 A display various  $\beta$ -sheet-rich conformations. The first cluster consists of disordered  $\beta$ -sheet-rich aggregates. The second and fifth clusters contain five- to eight-stranded  $\beta$ -barrels with mixed parallel/antiparallel strands. The third, sixth, and eighth clusters contain parallel  $\beta$ -sheet bilayers consisting of 4+3 and 4+4  $\beta$ -sheet sizes. Finally, the fourth and seventh clusters display two orthogonal  $\beta$ -sheets. The parallel and the orthogonal  $\beta$ -sheet bilayers have populations of 13.0% (6.6% + 3.7% + 2.7%) and 7.6% (4% + 3.6%), respectively.

In the presence of SWCNT, as shown in Fig. 3 A, the A $\beta$ (16-22) aggregates are fully amorphous, with clusters 1 and 4 being free of any  $\beta$ -sheet, and clusters 2, 3, 5, and 6–8 having two-stranded  $\beta$ -sheets. Aggregates containing three-stranded  $\beta$ -sheets (Fig. 3 B) are very rare (with a population of 0.3%), and aggregates containing four-stranded  $\beta$ -sheets are negligible ( $<0.01\%$ ). Overall, in contrast to the peptides in aqueous solution without SWCNT, none of the aggregates display parallel  $\beta$ -sheet bilayer, orthogonal  $\beta$ -sheet bilayer, or  $\beta$ -barrel structures.

Figs. 2 B and 3 C show the FELs of the peptides in A $\beta$ (16-22) and A $\beta$ (16-22)+SWCNT systems, respectively, as a function of RMSD1 and RMSD2. RMSD1 and RMSD2 are the  $C_{\alpha}$ -RMSDs of all conformations with respect to the  $\beta$ -barrel (cluster 2) and parallel  $\beta$ -sheet bilayer (cluster 8) shown in Fig. 2 A, respectively, which deviate from each other by a  $C_{\alpha}$ -RMSD of 0.7 nm. The locations of the first eight clusters are labeled on each free-energy surface. In the case of A $\beta$ (16-22) in solution, these clusters are delocalized on three basins (Fig. 2 B), whereas in the presence of SWCNT, all clusters belong to one attraction basin (Fig. 3 C).

The differences in the A $\beta$ (16-22) aggregates are further probed by the probability of the  $\beta$ -sheet sizes at 310 K (Fig. S4 A). We find that without SWCNT, the two- and three-stranded  $\beta$ -sheets have relatively high probabilities (20.6% and 13.6%), followed by four-stranded  $\beta$ -sheets (10.5%). With SWCNT, the population decreases rapidly with  $\beta$ -sheet size: two-stranded (6.7%), three-stranded (0.3%), and four-stranded (negligible,  $<0.01\%$ ). Differences are more pronounced for larger sizes of  $\beta$ -sheets. The probabilities of five-, six-, seven-, and eight-stranded  $\beta$ -sheets are respectively 3.2%, 2.5%, 1.1%, and 1.4% without SWCNT, whereas they vanish in the presence of SWCNT. A structural inspection shows that these five- to eight-stranded  $\beta$ -sheets consist of open or closed  $\beta$ -barrels as well as  $\beta$ -sheet bilayers.

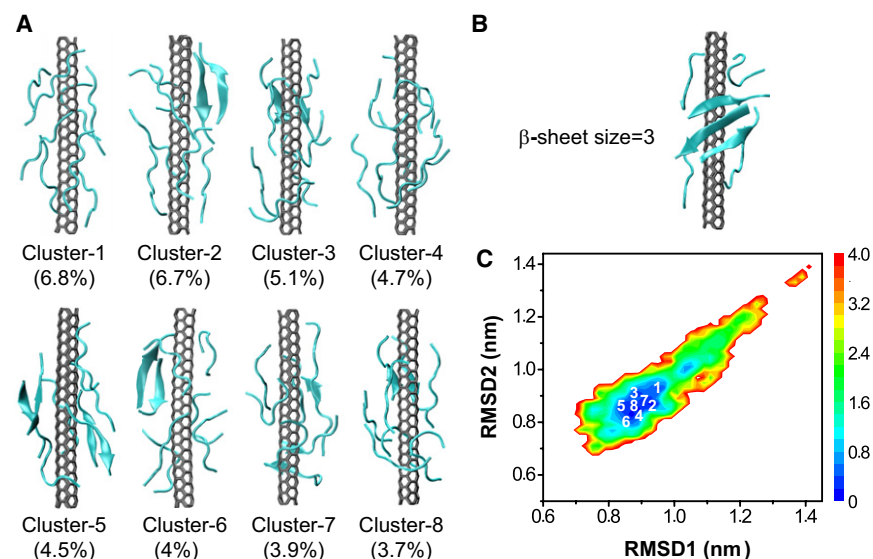


FIGURE 3 Structure analysis and FEL of A $\beta$ (16-22) octamers with SWCNT at 310 K. (A) Representative structures for the first eight most-populated clusters. (B) Representative structures containing the largest  $\beta$ -sheet (i.e., a three-stranded sheet). (C) FEL (in kcal/mol) versus RMSD1 ( $C_{\alpha}$ -RMSD relative to the  $\beta$ -barrel; cluster 2 in Fig. 2 A) and RMSD2 ( $C_{\alpha}$ -RMSD relative to the parallel  $\beta$ -sheet bilayer; cluster 8 in Fig. 2 A).

Finally, to explore the orientation preference of the strands in different sizes of  $\beta$ -sheets, we plot the PDF of the angle between two neighboring strands in a sheet as a function of  $\beta$ -sheet size (Fig. S4 B). Without SWCNT, the strands are predominantly antiparallel in a two-stranded  $\beta$ -sheet, in good agreement with previous computational studies (34,35). For sheet sizes of 3 and 4, the ratio of antiparallel to parallel strand alignment decreases, but the antiparallel alignment is still preferred. When the sheet size increases to  $\geq 5$ , the probabilities of antiparallel and parallel alignments become similar. In the presence of SWCNT, the antiparallel orientation is more populated for sheet sizes of 2 and 3.

## DISCUSSION

We performed two 110-ns all-atom REMD simulations in explicit solvent starting from A $\beta$ (16-22) octamer with random character for each chain without and with SWCNT. Without SWCNT, our simulation shows that the A $\beta$ (16-22) octamer has an average  $\beta$ -sheet content of 44.5% and mainly visits disordered  $\beta$ -rich states and, to a lesser extent, structures with cross- $\beta$  and  $\beta$ -barrel characteristics. The structure of the  $\beta$ -barrel is not unique, and the barrel topology includes five- to eight-stranded  $\beta$ -barrel-like structures. We expect that the probabilities of the ordered  $\beta$ -rich structures might be lower using the OPLS force field, and this remains clearly to be determined on the A $\beta$ (16-22) octamer. A previous computational study on two peptides showed that GROMOS96 overestimates the stability of the  $\beta$  conformation, and OPLS generates a better balance between  $\alpha$ -helical and  $\beta$ -sheet structures (58). A recent REMD study on A $\beta$ (16-22) dimer and trimer showed that GROMOS96 favors  $\beta$ -sheet structures, and OPLS predicts diverse structures (59).

We also observed these cross- $\beta$  structures and amorphous aggregates in our recent CG MD study of the A $\beta$ (16-22) octamer with the two termini of the peptide chain unblocked (36). The formation of a  $\beta$ -barrel-like structure was also revealed in previous computational studies on A $\beta$ (16-22) (33), KFFE (60),  $\beta$ 2m(83-89) (the 83-89 fragment of  $\beta$ 2-microglobulin) (61) in implicit solvent and generic sequences (62), and  $\beta$ 2m(83-89) in explicit solvent (63).

In the presence of SWCNT, our extensive REMD simulation starting from the same random A $\beta$ (16-22) state shows that the peptides adopt mostly disordered coil states, with an average  $\beta$ -sheet content of 7.9%. The parallel and orthogonal  $\beta$ -sheet bilayers are not populated. This result demonstrates that SWCNT strongly inhibits A $\beta$ (16-22)  $\beta$ -sheet formation, which consequently would significantly increase the lag phase time for nucleation. Our result is fully consistent with recent experimental studies conducted by Cabaleiro-Lago et al. (16), who reported that HP copolymeric NiPAM:BAM nanoparticles retard A $\beta$ 40 fibrillation by slowing down the nucleation process. In the same study,

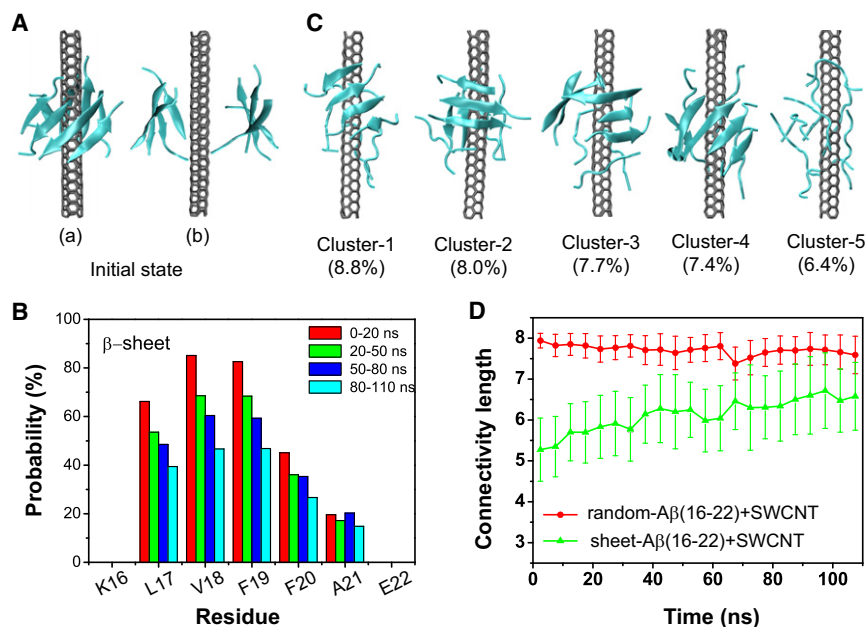
they showed that fibrillation of A $\beta$ 40 can be reversed by the addition of NiPAM:BAM nanoparticles up to a particular time point before mature fibrils appear. To determine whether SWCNT can destabilize prefibrillar A $\beta$ (16-22)  $\beta$ -sheets, we performed a third REMD run on the sheet-A $\beta$ (16-22)+SWCNT system.

## SWCNT destabilizes ordered prefibrillar $\beta$ -sheets and induces the formation of disordered coil aggregates

The results of the third REMD run at 310 K are given in Fig. 4. We first monitor the  $\beta$ -sheet probability of each residue at four time intervals: 0–20 ns, 20–50 ns, 50–80 ns, and 80–110 ns (Fig. 4 B). The  $\beta$ -sheet contents of the residues L17-V18-F19-F20 significantly decrease with simulation time, reducing to 38%, 46%, 46%, and 28% from their initial values of 67%, 86%, 84%, and 45%, respectively. The average  $\beta$ -sheet content within 0–20 ns is 60.3%, and it drops to 31.5% within an 80–110 ns time period.

The SWCNT-induced destabilization of  $\beta$ -sheet bilayer is illustrated by the time evolution of the CL at 310 K (Fig. 4 D). For comparison, the time evolution of CL in the random-A $\beta$ (16-22)+SWCNT system at 310 K is also given. The CL of the A $\beta$ (16-22) octamer in the sheet-A $\beta$ (16-22)+SWCNT system increases from its initial value of 5.2 to 6.7 in the last 30 ns of the simulation. Although the CL and the  $\beta$ -sheet content in sheet-A $\beta$ (16-22)+SWCNT system do not reach the same values of 7.7 and 7.9% as in the random-A $\beta$ (16-22)+SWCNT system within the 110-ns REMD run, their time evolutions reflect a dissociation of prefibrillar  $\beta$ -sheet structure by SWCNT and a propensity for random coil aggregates. We also reveal these features by performing a cluster analysis for 20,000 conformations generated within 70–110 ns using a C $_{\alpha}$ -RMSD of 0.3 nm. The centers of the first five most-populated clusters, representing 38.3% of all conformations, are shown in Fig. 4 C. It should be noted that the initial  $\beta$ -sheet bilayer structure, which becomes the 17th cluster, represents only 2.0% of the 20,000 conformations. The orthogonal  $\beta$ -sheet bilayer is not populated. Although the first four clusters are  $\beta$ -rich octamers, two to four of the eight chains are in random state. Moreover, all of the chains in cluster 5 are in a coil state. Of interest, a five-stranded open  $\beta$ -barrel wrapping around SWCNT is observed in cluster 4. The total population of five-, six-, seven-, and eight-stranded barrels is 2.1%, implying that barrel topologies are likely metastable states of A $\beta$ (16-22) oligomers in the presence of SWCNT. Of note, we also observed an SWCNT-induced  $\beta$ -barrel formation starting from a preformed  $\beta$ -sheet bilayer in our recent all-atom MD study of A $\beta$ (25-35) peptide (64).

Overall, although our simulation starting from an A $\beta$ (16-22)  $\beta$ -sheet bilayer is not fully converged, it demonstrates that the presence of SWCNT destabilizes  $\beta$ -sheet structures and induces the formation of disordered coil aggregates as



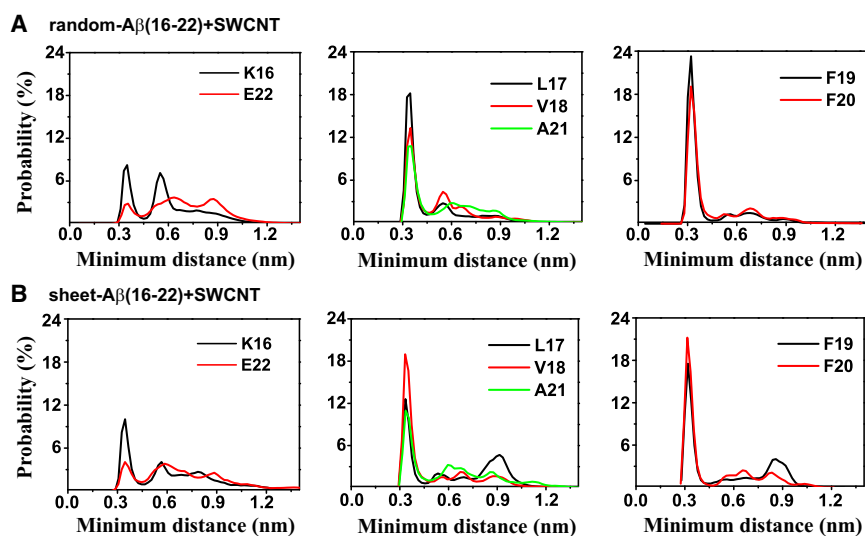
**FIGURE 4** Structural analysis of A $\beta$ (16-22) octamers generated in the 310 K REMD trajectory starting from a prefibrillar  $\beta$ -sheet octamer (cluster 8 in Fig. 2 A) with an SWCNT placed between the two  $\beta$ -sheets. (A) Two different views of the initial state, where *b* is the perpendicular view of *a*. (B)  $\beta$ -sheet content of each residue within four time intervals: 0–20 ns, 20–50 ns, 50–80 ns, and 80–110 ns. (C) Representative structures for the first five most-populated clusters. (D) Time evolution of the CL of the A $\beta$ (16-22) octamer in the sheet-A $\beta$ (16-22)+SWCNT system. For comparison, the time evolution of the CL in the random-A $\beta$ (16-22)+SWCNT system is also given. The number of CLs is averaged every 5 ns.

well as metastable  $\beta$ -barrel-like structures. This result indicates that the fibrillation of A $\beta$ 16-22 can be reversed at its early stage by the addition of SWCNT. Given that REMD simulations accelerate the sampling of MD simulations by an order of magnitude (47), our results indicate that full destabilization of the A $\beta$ (16-22)  $\beta$ -sheet octamer by SWCNT is a slow process, taking  $>1.1 \mu\text{s}$ .

### SWCNT inhibits A $\beta$ (16-22) $\beta$ -sheet formation through both HP and $\pi$ -stacking interactions

To understand the physical driving forces underlying the  $\beta$ -sheet inhibition and destabilization by SWCNT, we plot in Fig. 5 the probability distribution of the minimum dis-

tance between the side chain of each residue and SWCNT surface in the two REMD runs at 310 K (Fig. 5, A and B). Two probability peaks are seen for each residue, with a dominant peak centered at 0.35 nm for the HP residues L17-V18-F19-F20-A21. The probabilities of these HP residues at 0.35 nm are all greater than those of K16 and E22. In particular, the aromatic residues F19 and F20 have the highest probability at 0.35 nm. These data indicate that the HP residues L17–A21 have stronger interactions with SWCNT than the hydrophilic residues K16 and E22, and, remarkably, the interaction between the two aromatic residues (F19 and F20) and SWCNT is the strongest in both systems. Our results are consistent with electron microscope images showing that peptides containing aromatic rings have strong affinity with



**FIGURE 5** Probability distribution of the minimum distance between the side chain of each residue and SWCNT surface in the 310 K trajectory of the two REMD runs with SWCNT. The data are averaged over the last 80 ns for random-A $\beta$ (16-22)+SWCNT and the last 40 ns for sheet-A $\beta$ (16-22)+SWCNT.

carbon nanotubes (65), and recent atomic force microscopy and optical absorption spectroscopy experiments indicating that  $\pi$ -stacking interactions play an important role in peptide-SWCNT interactions (66).

To investigate the detailed interactions between the aromatic rings of Phe and SWCNT, we plot in Fig. 6 A the PDF of the centroid distance ( $d$ ) between the Phe ring and its closest SWCNT carbon ring. There are three peaks centered at 0.37, 0.5, and 0.75 nm, with a dominant peak at 0.37 nm. To probe the favorable orientation between the two rings around the three different distances, we calculate the PDF of the interplanar ring angle at a centroid distance of  $0.3 \leq d \leq 0.45$  nm (Fig. 6 B),  $0.45 < d \leq 0.65$  nm (Fig. 6 C), and  $d \geq 0.65$  nm (Fig. 6 D). A peak at  $15^\circ$  is observed in Fig. 6 B, indicating that the two rings have a strong preference to be parallel-aligned when  $d < 0.45$  nm. For  $0.45 < d \leq 0.65$  nm, the angle is mainly distributed in the range of  $60$ – $90^\circ$ , with almost equal population for each angle in this range, indicative of both perpendicular (T-shaped) and staggered ring organizations. When  $d > 0.65$  nm, the PDF curve is almost flat for the angle in the range of  $30$ – $90^\circ$ , with a rather broad peak around  $50^\circ$ , implying that the two rings can align in any orientation, including parallel and T-shaped ones, with a slight preference for a  $50^\circ$  orientation. These results suggest that there are many possible stacking patterns between Phe aromatic ring and SWCNT carbon ring, and the exact stacking orientation depends on their centroid distance. In particular, a parallel-aligned  $\pi$ -stacking geometry is likely to be the most favorable one at a short distance. This is supported

by the PDF curve of the angle for the ring centroid distance in the full distance range (Fig. S5), where a peak appears at  $15^\circ$ . Of interest, the analysis of  $\pi$ -stacking in a group of nonhomologous proteins with known x-ray crystal structures suggests a parallel-displaced  $\pi$ -stacking to be the major organization of  $\pi$ - $\pi$  interactions in proteins (67).

Finally, it is instructive to look at the role of water in all of the REMD simulations. To that end, we calculated the number of water molecules within 0.36 nm of every residue at five different stages of the simulations (Fig. S6). Previous experimental (68) and computational studies (44,64) showed that the expulsion of interfacial water molecules is a key event in the aggregation of amyloid peptides such as A $\beta$ (16-22) (44,68). Consistent with those studies, fast dehydration occurs in the early stage of A $\beta$ (16-22) oligomerization in solution without SWCNT (Fig. S6 A). The number of contacting water molecules with the five HP residues decreases within 2 ns and remains almost constant after 5 ns. Remarkably, a rapid dehydration process is also observed both in random-A $\beta$ (16-22)+SWCNT and sheet-A $\beta$ (16-22)+SWCNT systems (Fig. S6, B and C), indicating that the expulsion of water is an obligatory step in the interactions of A $\beta$ (16-22) peptide with SWCNT. As shown in Fig. S6 D, within the 70–110 ns time period, the hydration status of the A $\beta$ (16-22) peptide with and without SWCNT is quite similar, which implies that the water-peptide interaction is similar in magnitude among the three different systems, and the significant decrease in  $\beta$ -sheet content of A $\beta$ (16-22) aggregates in the presence of SWCNT results from the SWCNT-peptide interactions.

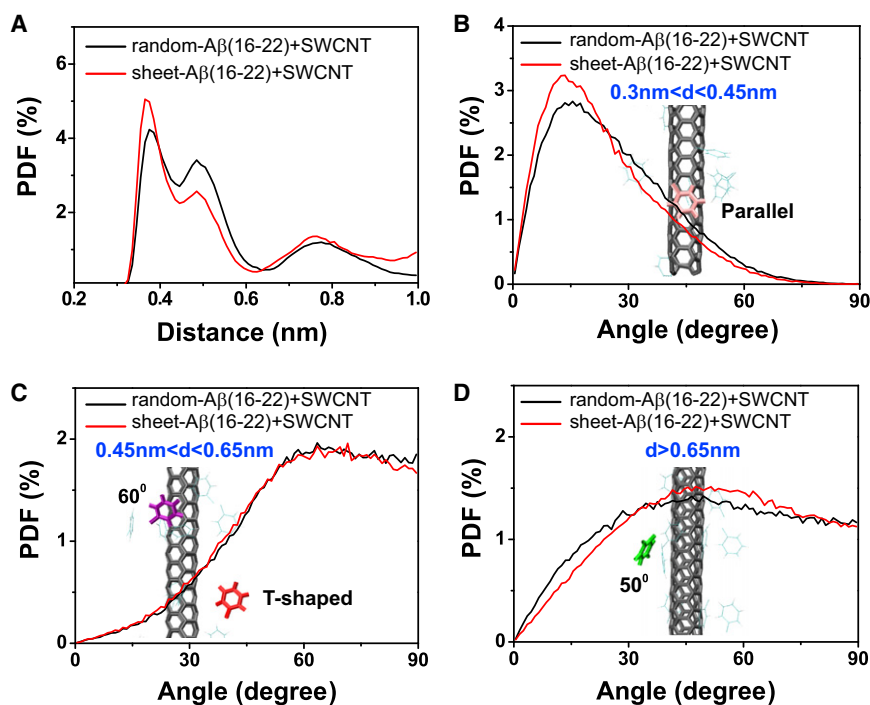


FIGURE 6 Analysis of  $\pi$ -stacking interactions between the Phe aromatic ring and the SWCNT carbon ring in random-A $\beta$ (16-22)+SWCNT and sheet-A $\beta$ (16-22)+SWCNT systems at 310 K. (A) The PDF of the centroid distance ( $d$ ) between the Phe ring (each Phe residue is considered) and its closest SWCNT carbon ring. (B–D) The PDF of the angle between the two rings with a centroid distance of (B)  $0.3 \leq d \leq 0.45$  nm, (C)  $0.45 < d \leq 0.65$  nm, and (D)  $d \geq 0.65$  nm. The selection of the three distances is based on the PDF peak in panel A.

## CONCLUSIONS

In summary, based on three 110-ns all-atom REMD simulations on A $\beta$ (16-22) octamers starting from two different conformations in the absence and presence of SWCNT, we propose the following inhibition mechanisms of SWCNT on A $\beta$ (16-22) nucleation (Fig. 7): Without SWCNT, random A $\beta$ (16-22) chains form various  $\beta$ -sheet-rich oligomers. The interaction of SWCNT with amorphous aggregates prevents  $\beta$ -sheet formation and leads to only disordered coil aggregates at equilibrium. The interaction of SWCNT with a prefibrillar  $\beta$ -sheet bilayer destabilizes the  $\beta$ -sheet structure and induces the formation of disordered coil aggregates.

An analysis of the probability distribution of the minimum distance between the side chain of each residue and the SWCNT surface provides evidence for strong HP interactions between the CHC residues L17–A21 with SWCNT, among which residues F19–F20 show the strongest interactions with SWCNT through  $\pi$ -stacking interactions. The interpeptide HP interactions and notably the aromatic stacking interactions have been demonstrated to be important for amyloid formation of several peptides, including A $\beta$ (16-22) (34,69,70). However, certain experimental observations show that mutations that replace the aromatic side chains of F19 and F20 with leucines or isoleucines promote aggregation of the A $\beta$ 42 peptide, indicating that aromatic  $\pi$ -stacking is not critical, at least for the full-length A $\beta$  peptide (71). The strong HP and  $\pi$ -stacking interactions between SWCNT and A $\beta$ (16-22) peptide would interfere with the peptide-peptide interactions that are responsible for A $\beta$ (16-22) aggregation, thus slowing down the nucleation process. The SWCNT used in this study has a diameter of 0.542 nm. It is expected that the increase in the SWCNT diameter would change the A $\beta$ (16-22)–SWCNT interaction, thus affecting the inhibition extents of SWCNT on A $\beta$ (16-22) aggregation. Further studies are needed to understand the effect of SWCNT diameter on A $\beta$ (16-22) aggregation.

The full-length A $\beta$ 42 peptide contains one hydrophilic patch spanning residues 1–15, and two HP regions spanning residues 17–21 and 30–42 separated by a hydrophilic linker, residues 22–29. Obviously, due to the hydrophilic character of the N-terminal region and of the linker, these two regions are not to be the most probable sites for A $\beta$ 42–SWCNT interactions. Region 30–42 with the amino acids A-I-I-G-L-M-V-G-G-V-V-I-A is certainly another probable binding site; however, this fragment is free of any aromatic residues. On the basis of our simulations, we hypothesize that the HP L17–A21 region is the most probable site for SWCNT interactions, and the resulting propensity of residues 17–21 to adopt random coil conformation upon binding to SWCNT is likely to reduce the  $\beta$ -sheet formation of the same residues in the A $\beta$ 40/42 oligomers, thereby prolonging the lag time for A $\beta$  nucleation. Our hypothesis is supported by a previous experimental study in which results from a Thioflavin T fluorescence assay showed that fullerene strongly inhibits A $\beta$ 40 aggregation at the early stage by specifically binding to the KLVFF motif (13). Overall, our findings provide significant insight into the inhibition mechanism of HP nanoparticles (notably SWCNT) against the aggregation of A $\beta$ (16-22) and full-length A $\beta$ , and provide what to our knowledge are new clues for the development of drug candidates against AD.

## SUPPORTING MATERIAL

Estimation of the integrated autocorrelation time of the potential energy, description of the analysis parameters, calculation of the chain-independent C $\alpha$ -RMSD, and six figures are available at [http://www.biophysj.org/biophysj/supplemental/S0006-3495\(11\)01177-5](http://www.biophysj.org/biophysj/supplemental/S0006-3495(11)01177-5).

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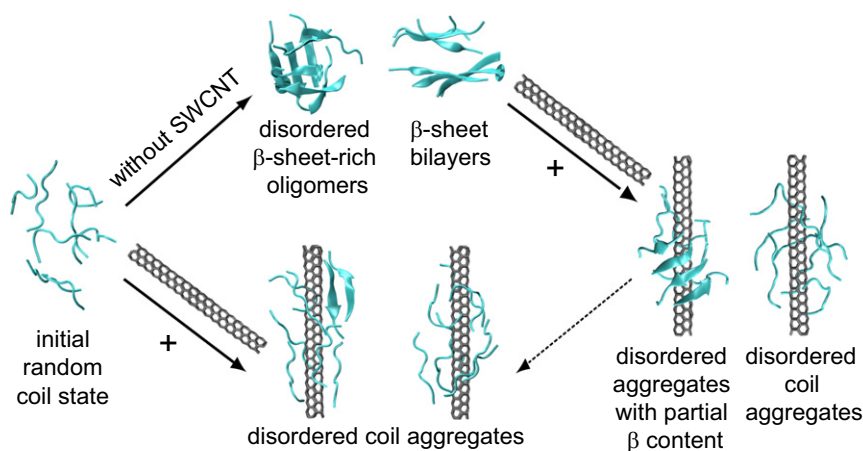


FIGURE 7 Proposed inhibition mechanism of A $\beta$ (16-22) nucleation by SWCNT, based on simulation results from three different REMD runs. All of the conformations are from the 110-ns REMD simulations.



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