Mapping Conformational Ensembles of $A\beta$ Oligomers in Molecular Dynamics Simulations

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ABSTRACT Although the oligomers formed by $A\beta$ peptides appear to be the primary cytotoxic species in Alzheimer's disease, detailed information about their structures appears to be lacking. In this article, we use exhaustive replica exchange molecular dynamics and an implicit solvent united-atom model to study the structural properties of $A\beta$ monomers, dimers, and tetramers. Our analysis suggests that the conformational ensembles of $A\beta$ dimers and tetramers are very similar, but sharply distinct from those sampled by the monomers. The key conformational difference between monomers and oligomers is the formation of β -structure in the oligomers occurring together with the loss of intrapeptide interactions and helix structure. Our simulations indicate that, independent of oligomer order, the $A\beta$ aggregation interface is largely confined to the sequence region 10–23, which forms the bulk of interpeptide interactions. We show that the fractions of β structure computed in our simulations and measured experimentally are in good agreement.

INTRODUCTION

Aberrant aggregation of polypeptide chains and subsequent amyloid fibril formation are linked to more than 20 various medical disorders, including Alzheimer's, Parkinson's, and Creutzfeldt-Jakob diseases ([1\)](#page-8-0). Biomedical experiments and genetic studies suggested that the onset of Alzheimer's disease is related to extracellular aggregation of $A\beta$ peptides ([2\)](#page-8-0), which are produced by natural cleavage of the transmembrane amyloid precursor protein. Although these peptides have varying lengths, the 40-residue species, $A\beta_{1-40}$, are most abundant. Their assembly into amyloid fibrils is a multistage conformational transition, in which mobile oligomeric species appear as intermediates on the pathway leading to mature fibrils [\(3–7](#page-8-0)). It has been long known that $A\beta$ fibrils are cytotoxic ([8\)](#page-8-0), but recent findings pointed to $A\beta$ oligomers as primary cytotoxic species in Alzheimer's disease [\(9,10\)](#page-8-0). Furthermore, synaptic structure and function can be impaired even by the smallest $A\beta$ oligomers, dimers [\(11](#page-8-0)). According to hydrogen/deuterium exchange experiments, soluble oligomeric species exist in dynamic equilibrium with amyloid fibrils [\(12](#page-8-0)). These observations implicate a crucial role played by $A\beta$ oligomers in amyloidogenesis.

A number of experimental studies have been focused on elucidating the structures of $A\beta$ monomers. In aqueous solution, they are largely random, lacking stable secondary or tertiary structures [\(13–15](#page-8-0)). Solid-state NMR experiments have probed the endproducts of amyloid assembly, $A\beta$ fibrils, revealing in-registry parallel β -sheet structure ([16–18\)](#page-8-0). In contrast to $A\beta$ monomers or fibrils, there is a lack of structural information on $A\beta$ oligomers. At micromolar concentration and normal physiological conditions,

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 $A\beta$ oligomers coexist with monomers ([19\)](#page-8-0) and demonstrate a distinctive size distribution existing predominantly as dimers, trimers, or tetramers ([20\)](#page-8-0). Higher order $(n > 4)$ oligomers have significantly smaller frequency of occurrence.

Molecular dynamics (MD) simulations, which probe $A\beta$ amyloid formation at all-atom resolution, can provide important structural information supplemental to the experiments ([21\)](#page-8-0). For example, conformational ensembles sampled by $A\beta_{1-40}$ monomer [\(22,23](#page-8-0)) and its fragments [\(24,25\)](#page-9-0) have been investigated. A full-length $A\beta_{1-40}$ was shown to have several structured regions, including short β -strands, helices, and β -turns, in generally random coil-like ensemble of conformations ([22,23](#page-8-0)). MD simulations of $A\beta$ oligomers, which are more computationally intensive, have been recently reported ([26–31\)](#page-9-0). In general, these studies have shown that aggregation leads to conformational changes in $\Lambda\beta$ peptides with respect to monomeric species. For example, we have previously shown that interpeptide interactions in $A\beta$ dimers shift the distribution of secondary structure, from helical states toward β -strand conformations ([28\)](#page-9-0).

Nevertheless, many questions concerning the oligomer structure remain unexplored. For example ([1\)](#page-8-0), what is the distribution of conformations sampled by individual $A\beta$ peptides in the oligomers? It is challenging to obtain this information in the experiments, which report the bulk averages of structural quantities [\(2](#page-8-0)). Are there differences between the conformational ensembles of oligomers of different orders and between those of oligomers and monomers? In other words, how does the structure of $A\beta$ peptides change with the progression of aggregation from monomers to, say, tetramers?

To answer these questions, we use exhaustive replica exchange MD (REMD) and an implicit solvent united-atom model to study the structural properties of $A\beta$ monomers, dimers and tetramers. Because dimers and tetramers

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represent the most abundant $A\beta$ oligomers, some tentative conclusions about $A\beta$ oligomers and their comparison with the monomers can be made. In this work we use the N-terminal truncated fragment of the full-length peptide, $A\beta_{10-40}$ (Fig. 1 a). According to the experiments [\(15,17,32,33\)](#page-8-0) and simulations ([28,34](#page-9-0)) truncation of the first nine N-terminal amino acids results in minor changes in the conformational ensembles of $A\beta$ monomers, oligomers, and fibrils (see the [Supporting Material](#page-8-0) for details). Consequently, we use $A\beta_{10-40}$ as a model of the full-length $A\beta_{1-40}$ peptide.

First, we show that the distributions of $A\beta$ peptide conformations are similar in dimers and tetramers, but are sharply different from those sampled in monomeric species.

Second, the oligomer conformational ensemble is characterized by few distinct structural basins, in which the majority of $A\beta$ peptides reside. These basins differ with respect to the distribution of secondary structure and the amount of interand intrapeptide interactions.

Third, our simulations suggest that independent of oligomer order *n*, the $A\beta$ aggregation interface is largely confined to the sequence region 10–23, which forms the bulk of interpeptide interactions. We conclude the article by comparing the computational and experimental distributions of secondary structure.

METHODS

Simulation model

To probe the conformational ensembles of $A\beta$ peptides, we employed the CHARMM MD program ([35\)](#page-9-0), the united-atom force field CHARMM19, and the SASA implicit solvent model ([36\)](#page-9-0). The description of the CHARMM19+SASA model and its testing were reported in our previous studies [\(28,34,37,38\)](#page-9-0). In recent years, the CHARMM19+SASA model has been used in protein folding simulations [\(39,40](#page-9-0)) and to study aggregation of amyloidogenic peptides [\(41,42\)](#page-9-0). Arguments supporting the use of CHARMM19+SASA implicit solvent model are presented in the [Support](#page-8-0)[ing Material](#page-8-0).

FIGURE 1 (a) The sequence of $A\beta_{10-40}$ peptide and the allocation of the N-terminal Nt and C-terminal Ct regions. $(b-d)$ Three A β_{10-40} species studied in our simulations: (b) monomer, (c) dimer, and (d) tetramer. The N- and C-terminals are colored in shades of red and yellow, respectively. The Nt region tends to form most of the interpeptide interactions. The structures are visualized using Chimera ([50\)](#page-9-0).

Three $A\beta_{10-40}$ systems—monomer, dimer, and tetramer—were considered ([Fig. 1\)](#page-1-0). Their description can be found in our previous studies [\(28,34,43\)](#page-9-0). Briefly, the monomer, dimer, and tetramer systems involve one, two, or four identical unconstrained $A\beta_{10-40}$ peptides, respectively. The simulation systems utilized spherical boundary condition with the radius $R_s = 90 \text{ Å}$ and the force constant $k_s = 10 \text{ kcal/(mol Å}^2)$. The concentration of $A\beta$ peptides was therefore on the order of mM. Because in vitro $A\beta$ peptides exist predominantly in the form of monomers through tetra-mers [\(20](#page-8-0)), the three in silico systems represent the most abundant $A\beta$ species (excluding the trimers).

Replica exchange simulations

Conformational sampling was performed using replica exchange molecular dynamics (REMD) [\(44\)](#page-9-0). The description of REMD implementation can be found in our previous studies [\(28,34](#page-9-0)). Briefly, 24 replicas were distributed linearly in the temperature range from 300 to 530 K with the increment of 10 K. The temperature range spans the spectrum of $A\beta$ conformational states from aggregated (or collapsed) to completely dissociated (or open). Due to small temperature increments, the energy distributions from neighboring replicas share significant overlap. The exchanges were attempted every 80 ps between all neighboring replicas with the average acceptance rate of 67% (monomer), 54% (dimer), and 38% (tetramer). In all, four (monomer), seven (dimer), or eight (tetramer) REMD trajectories were produced resulting in the cumulative simulation times of 76 (monomer), 134 (dimer), and 154 μ s (tetramer). The structures were saved every 40 ps. Between replica exchanges, the system evolved using NVT underdamped Langevin dynamics with the damping coefficient $\gamma = 0.15 \text{ ps}^{-1}$ and the integration step of 2fs. Because the initial parts of REMD trajectories are not equilibrated and must be excluded from thermodynamic analysis, the cumulative equilibrium simulation time was reduced to $\tau_{\text{sim}} \approx 72$, ≈ 113 , and $\approx 126 \,\mu$ s. The REMD trajectories were started with random distributions of peptides in the sphere equilibrated at 600 K. In the initial structures, all peptides were dissociated.

Computation of structural probes

The interactions formed in $A\beta$ peptides and oligomers were analyzed by considering side-chain contacts and hydrogen bonds (HBs). A side-chain contact is formed, if the distance between the centers of mass of side chains is $<$ 6.5Å. Two peptides are considered aggregated, if there is at least one side-chain contact between them. Backbone HBs between NH and CO groups were assigned according to Kabsch and Sander ([45\)](#page-9-0). We defined two classes of interpeptide backbone HBs. The first includes any HBs between the peptides. The second class is restricted to parallel β -sheet HBs. A parallel HB (pHB) is formed between the residues i and j , if at least one other HB is also present between $i + 2$ and j or $j + 2$ (or between $i - 2$ and j or $j - 2$). The definition of pHB follows from the structural analysis of parallel β -sheets. Secondary structure in A β peptides was computed using the distribution of (ϕ, ψ) backbone dihedral angles. Specific definitions of β -strand and helix states can be found in our previous studies [\(28](#page-9-0)).

Throughout this article, angle brackets $\langle \ldots \rangle$ imply thermodynamic averages. Because dimer and tetramer include several indistinguishable peptides, we report averages over two and four peptides, respectively. The distributions of states produced by REMD were analyzed using multiple histogram method [\(46](#page-9-0)). The convergence of REMD simulations and error analysis were reported in our previous studies ([28,43\)](#page-9-0). In particular, the thermodynamic quantities probing inter- and intrapeptide interactions have the errors of 1% (tetramer) and $\leq 4\%$ (dimer or monomer). The errors in computing the conformational states of individual residues did not exceed 7% for the tetramer and monomer and 8% for the dimer.

Cluster analysis of $A\beta$ conformations

The cluster analysis of $A\beta$ peptide conformations is described in the [Sup](#page-8-0)[porting Material.](#page-8-0)

RESULTS

The conformational ensembles of $A\beta_{10-40}$ monomers, dimers, and tetramers were investigated using REMD simulations [\(Fig. 1\)](#page-1-0). Before presenting the results, it is useful to define the sequence regions in $A\beta$ peptide. Following the experimental $A\beta$ fibril structure [\(17](#page-8-0)), we distinguish the N-terminal (Nt, residues 10–23), which corresponds to the first fibril β -strand, and the C-terminal (Ct, residues 29–39), which corresponds to the second fibril β -strand ([Fig. 1](#page-1-0) *a*). All thermodynamic quantities for $A\beta$ oligomers and monomers are reported at the temperature 360 K, at which $A\beta$ peptide locks into fibril-like state during fibril growth ([37,42\)](#page-9-0). The selection of this temperature facilitates the comparison of conformational changes occurring upon aggregation, up to the deposition of $A\beta$ peptides into the fibril.

Conformational propensities of $A\beta$ oligomers and monomers

To probe the formation of $A\beta$ oligomers we computed the numbers of interpeptide side-chain contacts $\langle C(T) \rangle$ and hydrogen bonds (HBs) $\langle N_{hb}(T) \rangle$ formed by a peptide with other chains in the oligomer. Their temperature dependences shown in Fig. 2 indicate that the number of interpeptide interactions increases with the decrease in temperature T. At 360 K, the number of interpeptide contacts $\langle C \rangle$ for the tetramer is 55.1, whereas interpeptide HBs $(\langle N_{hb} \rangle \approx 6.3)$ are relatively few [\(Table 1\)](#page-3-0). Furthermore, tetramer almost completely lacks pHBs, which probe the formation of parallel β -sheets ($\langle N_{phb} \rangle \approx 0.8$). A β peptide in the tetramer also forms a large number of intrapeptide interactions. For example, the numbers of intrapeptide sidechain contacts and HBs are $\langle C_i \rangle \approx 25.7$ and $\langle N_{ihb} \rangle \approx 8.0$,

FIGURE 2 Assembly of $A\beta_{10-40}$ tetramer is probed by the thermal averages of the numbers of interpeptide side-chain contacts $\langle C(T) \rangle$ (solid line) and HBs $\langle N_{hb}(T) \rangle$ (dashed line) as a function of temperature. The plot demonstrates the formation of $A\beta_{10-40}$ tetramer with the decrease in temperature.

TABLE 1 $A\beta_{10-40}$ structural characteristics

*Numbers in parentheses are the fractions of β -structure in the Nt and Ct regions, respectively.

[†]Numbers in parentheses are the fractions of helix in the Nt and Ct regions, respectively.

Experimental fraction of β -structure from Ono et al. ([20\)](#page-8-0).[§]Oligomer order *n*. Monomer has *n* = 1

⁸Oligomer order *n*. Monomer has $n = 1$.

{ Data from Takeda and Klimov ([34,47\)](#page-9-0).

"Data from Takeda and Klimov [\(42](#page-9-0)).

respectively (Table 1). The probability of forming a tetramer at 360 K is ≈ 1.0 (see [Discussion](#page-5-0)).

With respect to the tetramer, $A\beta$ peptide in the dimer is engaged in fewer interpeptide interactions (Table 1). The numbers of side-chain contacts, $\langle C \rangle$, and HBs, $\langle N_{hb} \rangle$, are reduced approximately in half (to 30.0 and 3.7, respectively). However, little difference is observed in the numbers of intrapeptide interactions (side-chain contacts and HBs) in the tetramer and dimer (Table 1). As in the tetramer, pHBs are largely absent in the dimer ($\langle N_{phb} \rangle \approx 0.4$). The distributions of interpeptide interactions in $A\beta$ oligomers, including the formation of parallel and antiparallel side chain contacts, are analyzed in the [Supporting Material.](#page-8-0) It is also instructive to compare the intrapeptide interactions in the oligomers with those formed in the monomeric $A\beta$. At 360 K, the monomer contains $\langle C_i \rangle \approx 32.2$ side-chain contacts and $\langle N_{ihb} \rangle \approx 14.1$ HBs (Table 1).

The average fractions of β -strand and helix structure, $\langle S_t \rangle$ and $\langle H_t \rangle$, in A β tetramer are 0.39 and 0.20 (Table 1). The secondary structure distributions for the dimer and monomer were reported in our previous studies [\(34,47\)](#page-9-0). Using those findings, the changes in the β and helix structure in the tetramer with respect to the dimer are $\Delta S_{t-d} = \langle S_t \rangle$ – $\langle S_d \rangle = 0.02$ and $\Delta H_{t-d} = \langle H_t \rangle - \langle H_d \rangle = -0.01$ (where $\langle S_d \rangle$ and $\langle H_d \rangle$ are the β -strand and helix fractions in the dimer from Table 1). Similarly, using the β -strand and helix fractions in the monomer $\langle S_m \rangle$ and $\langle H_m \rangle$ (Table 1), the changes in the secondary structure in the tetramer with respect to the monomer are $\Delta S_{t-m} = \langle S_t \rangle - \langle S_m \rangle = 0.15$ and $\Delta H_{t-m} =$ $\langle H_t \rangle - \langle H_m \rangle = -0.12$. [Fig. 3](#page-4-0) a presents the distribution of secondary structure, $\langle S_t(i) \rangle$ and $\langle H_t(i) \rangle$, in A β tetramer and compares it with the dimer and monomer distributions ([34,47](#page-9-0)). Not only the fractions $\langle S \rangle$ and $\langle H \rangle$ but also the distributions $\langle S(i) \rangle$ and $\langle H(i) \rangle$ for the tetramer and dimer are almost identical. For example, compared to the dimer, the change in the tetramer β -fraction in the Nt region is $\Delta S_{t-d}(Nt) = \langle S_t(Nt) \rangle - \langle S_d(Nt) \rangle = 0.01$, whereas the change in the Ct is $\Delta S_{t-d}(Ct) = 0.02$. According to Table 1 in the Nt, the helix fraction changes by $\Delta H_{t-d}(Nt) = \langle H_t(Nt) \rangle$ – $\langle H_d(Nt) \rangle = -0.01$ and the same change is observed in the Ct ($\Delta H_{t-d}(Ct) = -0.01$). In contrast, [Fig. 3](#page-4-0) a implicates profound differences in the secondary structure distributions between the tetramer and monomer. Specifically, the changes in the β -content in the Nt and Ct regions are $\Delta S_{t-m}(Nt) = 0.20$ and $\Delta S_{t-m}(Ct) = 0.09$ (Table 1). For the helix fractions we get $\Delta H_{t-m}(Nt) = -0.20$ and $\Delta H_{t-m}(Ct) = -0.05$ (Table 1).

Additional information concerning the secondary structure propensities follows from the distributions of β -strand and helix lengths. [Fig. 3](#page-4-0) b displays the distributions of the number of residues $\langle N(L_s) \rangle$ in the β -strand fragments of the length L_s . Consistent with the enhanced β -content in $A\beta$ tetramers and dimers, long β -strands occur more frequently in the oligomers than in the monomer. For example, the average number of residues participating in long β -strands ($L_s \geq 3$) is 4.9 for the tetramer, 4.4 for the dimer, and 2.9 for the monomer. (Because $\langle N(L_s) \rangle$ is a thermally weighted quantity, it may be smaller or larger than L_s depending on the probability of occurrence of the strands of the length L_s . Same argument applies to $\langle N(L_h) \rangle$.) [Fig. 3](#page-4-0) b reveals that the tetramer and dimer $\langle N(L_s) \rangle$ distributions are similar, but both differ from the monomer distribution. As an illustration, consider $\langle N(L_s) \rangle$ for $L_s = 4$. The number of residues involved in the four-residue strands in the tetramer is just 10% larger than in the dimer, but it exceeds threefold the $\langle N(L_s = 4) \rangle$ value for the monomer. The inset to [Fig. 3](#page-4-0) b shows the numbers of residues $\langle N(L_h) \rangle$ in helix fragments of the length L_h . Similar to $\langle N(L_s) \rangle$, the distributions of helices in the tetramer and dimer are in close agreement. For example, the average number of residues found in "long" helices ($L_h \ge 4$) is 1.9 for the tetramer and 2.0 for the dimer. Therefore, [Fig. 3](#page-4-0), a and b , implicate nearly identical distributions of the secondary structure in the tetramer and dimer, both of which are different from the monomeric one.

Finally, we probe the secondary structure propensities by computing the free energy landscapes for $A\beta$ oligomers and monomers. [Fig. 3](#page-4-0) c shows the free energies $F(S)$ for the three $A\beta$ species as a function of the fraction of residues in the β -strand conformation S. The β -structure is most stable in the tetramer ($\Delta F_t = -8.6RT$) and dimer (ΔF_d = $-7.8RT$). Both oligomer profiles $F(S)$ reveal a broad, almost flat minimum spanning the range of S values from ~ 0.2 to 0.6. In contrast, the monomer profile computed earlier ([34\)](#page-9-0) is shifted to smaller S and more shallow. As a result,

FIGURE 3 (a) The fractions of helix $\langle H(i) \rangle$ and β -strand $\langle S(i) \rangle$ structure sampled by residues i in $A\beta_{10-40}$ tetramer (solid circles), dimer (shaded circles), and monomer (open circles). (b) Distribution of the numbers of residues $\langle N(L_s) \rangle$ involved in β -strand fragments of the length L_s . The data for tetramer, dimer, and monomer are shown by open, shaded, and solid bars. (*Inset*) Distribution of the numbers of residues $\langle N(L_h) \rangle$ involved in helix fragments of the length L_h . The data for tetramer and dimer are shown by shaded and open bars. (c) Free energy $F(S)$ of $A\beta_{10-40}$ peptide as a

Conformational clusters of $A\beta$ oligomers and monomers

To map the conformational distributions we apply the clustering procedure to the equilibrium structures of $A\beta$ monomers, dimers, and tetramers (see [Methods](#page-1-0), [Tables 2–4,](#page-5-0) and [Fig. 4](#page-6-0)). In this section, we first describe the conformational clusters of $A\beta$ peptides in the tetramer. The dimer and monomer clusters are then compared with the tetramer ones. There are three major conformational clusters in the tetramer, T1–T3, which together comprise 88% of all structures [\(Fig. 4\)](#page-6-0). The distinctive feature of the most populated cluster T1 is the large fraction of residues in β -strand conformation, which is evenly present in the Nt and Ct regions, and the low helix content ($S = 0.46$ vs. $H = 0.14$, [Table 2\)](#page-5-0). This cluster is characterized by the largest numbers of interpeptide interactions ($C = 60.9$ and $N_{hb} = 8.2$) and the smallest number of intrapeptide HBs ($N_{ihb} = 5.2$). Due to elevated β content, T1 is referred to as β -structure cluster. In contrast to T1, the cluster T2 has almost equal fractions of residues sampling β -strand and helix states (S = 0.29) and $H = 0.30$, [Table 2\)](#page-5-0). The helix structure localized in the Nt $(H(Nt) = 0.52)$ exceeds the β -fraction $(S(Nt) =$ 0.16) threefold [\(Table 2\)](#page-5-0). In T2 there are fewer interpeptide interactions compared to T1 as the number of interpeptide contacts C is reduced almost 20% (to 51.0) and the number of interpeptide HBs is halved (to 4.8). However, compared to the T1 the number of intrapeptide HBs in the T2 is doubled (to 10.8). Consequently, we refer to T2 as helical cluster. The third cluster T3 resembles T2, but has lower helix content, especially in the Nt, where the helix fraction is reduced by a factor of 1.6 to $H(Nt) = 0.32$. The cluster T3 has also low β -content in the Ct, which is reduced almost twofold compared to T1 or T2. Because T3 forms as much intrapeptide interactions as T2, it represents collapsed $A\beta$ conformations. In all the clusters T1–T3, the Nt is the main aggregation interface. The ratio of the numbers of interpeptide contacts formed by the Nt and Ct, $C(Nt)/C(Ct)$, is the largest in T3 (2.6) followed by T1 (2.0) and is the smallest in T2 (1.6).

function of the fraction of residues in the β -strand conformation S: tetramer (solid circles), dimer (shaded circles), and monomer (open circles). The free energy of β structure is $\Delta F = F_{\beta} - F(S = 0)$, where F_{β} is obtained by integrating over the S states, for which $F(S) \leq F_{\text{min}} + 1.0RT$ and F_{min} is the minimum in $F(S)$. The free energy $F(S)$ is computed using multiple histogram method ([46\)](#page-9-0). This figure suggests that the secondary structure distributions in the tetramers and dimers are similar, but differ sharply from that in the monomer. The plots are computed at 360 K.

TABLE 2 Structural clusters in $A\beta_{10-40}$ tetramer

*Fraction of structures included in the cluster, i.e., occurrence probability.

Fractions of β -structure in A β peptide and in the Nt and Ct terminals (in parentheses).

Fractions of helix in $A\beta$ peptide and in the Nt and Ct terminals (in parentheses).
[§]Number of interpetide contects formed by a pentide in olicomer

⁸Number of interpeptide contacts formed by a peptide in oligomer.

{ Numbers of interpeptide contacts formed by the Nt and Ct sequence regions.

^{II}Number of interpeptide HBs formed by a peptide in oligomer.

**Number of intrapeptide HBs in a peptide.

Similar to the tetramer, there are three main clusters in the dimer, D1–D3, which together represent 91% of structures (Table 3 and [Fig. 4](#page-6-0)). The β -structure cluster D1 is almost identical to T1. The cluster D2, which features elevated helix structure in the Nt, resembles the tetramer T2. It follows from Tables 2 and 3 that similarity between the tetramer T1-T2 and dimer D1-D2 clusters is manifested in the distributions of secondary structure and intrapeptide interactions. As expected for the dimer, D1 and D2 form fewer interpeptide interactions compared to the tetramer. Finally, there are close parallels between the collapsed clusters D3 in the dimer and T3 in the tetramer. As T3, the dimer cluster displays extensive intrapeptide interactions and the low Nt helix and Ct strand contents compared to those seen in D2. Table 3 shows that matching dimer and tetramer clusters have almost identical occurrence probabilities. As for the tetramer, a polarized aggregation interface is observed in all dimer clusters. The largest ratio $C(Nt)/C$ $(Ct) = 2.2$ is found in the collapsed cluster D3, whereas the helix D2 has the lowest ratio (1.7).

The monomeric structures partition into two main clusters, M1 and M2, which combined represent 88% of $A\beta$ conformations ([Table 4](#page-6-0) and [Fig. 4\)](#page-6-0). The most populated cluster M1 resembles the dimer D2 and tetramer T2 clusters. It features similar β -strand and helix fractions (S = 0.26 and $H = 0.31$). With the helix structure being localized in the Nt region, $H(Nt)$ in M1 is identical to the respective values for D2 and T2 in Tables 2 and 3. Furthermore, the number of intrapeptide HBs in M1 ($N_{ihb} = 12.9$) is similar to N_{ihb} in D2 and T2 (Tables 2 and 3). The second cluster M2, which

is less populated than M1, differs from all dimer or tetramer clusters. It is characterized by elevated helix structure $(H = 0.37)$ and suppressed β -structure $(S = 0.17)$. The distinctive feature of all-helix M2 is the large number of intrapeptide HBs ($N_{ihb} = 17.4$), which is increased ~50% compared to M1.

DISCUSSION

Conformations of $A\beta$ peptides in dimers and tetramers are similar

Our REMD simulations suggest that the conformational ensembles of $A\beta$ peptides in the dimers and tetramers are similar. This conclusion is based on the following observations.

 $A\beta$ peptides in the dimers and tetramers form similar amount of intrapeptide interactions. For example, the differences in the numbers of intrapeptide HBs $\langle N_{ihb} \rangle$ and sidechain contacts $\langle C_i \rangle$ are merely 18% and 6% ([Table 1](#page-3-0)).

Although there are more interpeptide interactions formed in the tetramer than in the dimer, their distributions in both oligomers are very similar (see the [Supporting Material\)](#page-8-0). Indeed, the number of contacts between the sequence regions s1 and $s2 (= Nt, Ct)$ in the dimer can be obtained by rescaling those formed in the tetramer, i.e., $\langle C_d(s1, s2) \rangle \approx$ 0.6 $\langle C_t(s1, s2) \rangle$ (see the [Supporting Material](#page-8-0)). More importantly, the Nt terminal forms two-thirds of all interpeptide interactions in the tetramer and dimer ($\langle C(Nt) \rangle \approx 2 \langle C(Ct) \rangle$), implicating the Nt region as the main aggregation interface

TABLE 3 Structural clusters in $A\beta_{10-40}$ dimer

		.					
Cluster					(C(Nt), C(Ct))	N_{hb}	N_{ihb} **
D1	0.47	0.44(0.46, 0.45)	0.15(0.22, 0.09)	33.1	(17.5.9.5)	4.7	6.9
D ₂	0.25	0.27(0.15, 0.42)	0.31(0.52, 0.12)	28.8	(15.3.8.8)	2.9	11.7
D3	0.19	0.29(0.32, 0.23)	0.26(0.36, 0.20)	27.3	(15.5, 7.1)	2.7	13.1

*Fraction of structures included in the cluster, i.e., occurrence probability.

Fractions of β -structure in A β peptide and in the Nt and Ct terminals (in parentheses).

Fractions of helix in $A\beta$ peptide and in the Nt and Ct terminals (in parentheses).
[§]Number of interpetide contects formed by a pentide in olicomer

⁸Number of interpeptide contacts formed by a peptide in oligomer.

{ Numbers of interpeptide contacts formed by the Nt and Ct sequence regions.

**Number of intrapeptide HBs in a peptide.

^{II}Number of interpeptide HBs formed by a peptide in oligomer.

TABLE 4 Structural clusters in $A\beta_{10-40}$ monomer

Cluster	n*		ΗŦ	$N_{ihb}^{\quad S}$
M1	0.55	0.26(0.16, 0.35)	0.31(0.52, 0.15)	12.9
M ₂	0.33	0.17(0.13, 0.24)	0.37(0.54, 0.21)	17.4

*Fraction of structures included in the cluster, i.e., occurrence probability. [†]Fractions of β -structure in A β peptide and in the Nt and Ct terminals (in parantheses) (in parentheses).

[‡]Fractions of helix in $A\beta$ peptide and in the Nt and Ct terminals (in paren-
theses) theses).

x Number of intrapeptide HBs in a peptide.

in $A\beta$ oligomers. It is also noteworthy that there are few parallel HBs in the dimers and tetramers, which are the hallmark of fibril structure [\(17](#page-8-0)). No preference for parallel or antiparallel aggregation interface is observed in $A\beta$ oligomers (see the [Supporting Material\)](#page-8-0).

There are similarities in the secondary structure. For example, the fractions of β -strand and helix structure in

Monomer

the tetramer and dimer differ by 5% [\(Table 1\)](#page-3-0). [Fig. 3](#page-4-0) a demonstrates that the distributions of secondary structure along $A\beta$ sequence are nearly identical in both oligomers. The fractions of β -strand and helix structure in the Nt and Ct do not differ by $>5\%$ (the exception is $\langle H(Ct) \rangle$ being different by \sim 10%). Furthermore, as illustrated in [Fig. 3](#page-4-0) b the distributions of β -strands and helix fragments in the tetramer and dimer are similar. Finally, [Fig. 3](#page-4-0) c demonstrates that the free energy of the β -strand structure in the tetramer is only marginally lower than in the dimer $(\Delta \Delta F_{t-d} \leq RT).$

Computation of conformational clusters provides the most compelling evidence for the similarity of the dimer and tetramer conformational ensembles [\(Tables 2 and 3](#page-5-0) and Fig. 4). The three conformational clusters T1–T3 in the tetramer match the clusters D1–D3 in the dimer. Importantly, not only are the structural characteristics of these clusters similar, but so are the probabilities of their

FIGURE 4 Conformational ensembles of $A\beta_{10-40}$ peptides in monomers, dimers, and tetramers at 360 K. The figure shows typical peptide structures from populated conformational clusters. Shaded arrows indicate similarities between the clusters. The cluster characteristics are given in [Tables 2–4.](#page-5-0) The N- and C-terminals are colored in shades of red and yellow, respectively. The picture demonstrates that the conformational ensembles of monomers and oligomers are distinct, whereas $A\beta_{10-40}$ peptides in the dimers and tetramers sample similar structural distributions. The structures are visualized using Chimera [\(50](#page-9-0)).

occurrence. Because the three clusters in the tetramer and dimer comprise $\sim 90\%$ of A β conformations, we suggest that, at least for small oligomers, $A\beta$ conformational ensembles are independent of the oligomer order n .

Our findings indicate that in contrast to monomers the β -structure in A β oligomers occurs more frequently than the helix conformations. The enhancement of β -structure in oligomers is driven by the formation of interpeptide interactions, mostly by side-chain contacts with minor contribu-tion from HBs ([Table 1\)](#page-3-0). Most β -strands in the oligomers are short [\(Fig. 3](#page-4-0) b) and, because they form few parallel HBs, ordered β -sheets are rare. Therefore, the oligomer structure contains few elements of fibril-like conformations.

Conformations of $A\beta$ peptides in oligomers and monomers are distinct

It follows from our results that the conformational ensembles of $A\beta$ oligomers and monomers are different. Following the same approach used for comparing the dimers and tetramers, we identify the following differences.

 $A\beta$ monomers and oligomers differ with respect to the distribution of intrapeptide interactions. For example, compared to the tetramer the number of intrapeptide HBs in the monomer increases 80% coupled with 25% increase in the number of side-chain contacts ([Table 1\)](#page-3-0).

The secondary structures in $A\beta$ monomers and oligomers are different. The fractions of β -strand and helix structure in the tetramer are 40% larger and 60% lower, respectively, than in the monomer ([Table 1](#page-3-0)). [Fig. 3](#page-4-0) α shows that there are striking dissimilarities in the distributions of secondary structure along $A\beta$ sequence. For example, the fraction of β -strand in the Nt regions of the tetramer $\langle S_t(Nt) \rangle$ exceeds that for the monomer $\langle S_m(Nt) \rangle$ by more than twofold. The distributions of β -strands in the tetramer and monomer also differ considerably ([Fig. 3](#page-4-0) b and Results). Consistent with these findings indicating the enhancement of β content in the oligomers, the free energy of the β -strand structure in the monomer is $\approx 3.0RT$ higher than in the tetramer.

The analysis of conformational clusters reveals that the oligomer and monomer conformational ensembles are different [\(Tables 2–4](#page-5-0) and [Fig. 4](#page-6-0)). The monomer distribution contains only two clusters, of which only one, M1, bears similarity to the oligomer clusters T2 or D2. Therefore, the monomer samples significant fraction (-0.3) of conformations (the all-helix cluster M2), which are not seen in the oligomers. Conversely, the oligomers contain the clusters (T1,T3 and D1,D3) with elevated β -strand content $(S \ge 0.3)$ not observed in the monomers. For example, in T1 and D1 the fraction of β structure approaches 0.5 in both sequence regions Nt and Ct.

In summary, the key difference between the conformational ensembles of monomers and oligomers is the increase in β -structure in the oligomers occurring together with the loss of intrapeptide interactions. These changes are manifested by the disappearance of the monomeric cluster M2, emergence of the new oligomeric clusters T1,T3 (or D1,D3), and decrease in the statistical weight of the cluster M1 (D2,T2) [\(Tables 2–4](#page-5-0) and [Fig. 4](#page-6-0)).

Comparing experimental and computational $A\beta$ conformational ensembles

Recent experiments employing photoinduced chemical crosslinking technique probed the structures of $A\beta$ aggregated species [\(20](#page-8-0)). The CD analysis of secondary structure revealed that the most profound conformational change occurs upon the conversion of monomers into dimers. [Table 1](#page-3-0) shows that this conversion results in the increase in the β -content from $S_m^{exp} = 0.24$ (monomer) to $S_d^{exp} = 0.39$ (dimer). The difference in the fractions of β -structure 0.39 (dimer). The difference in the fractions of β -structure in the dimer and tetramer is relatively small $(S_d^{exp} = 0.39)$ vs. $S_t^{\text{exp}} = 0.45$ in [Table 1](#page-3-0)). Therefore, monomer-to-dimer conversion results in $\approx 60\%$ increase in β -fraction, whereas there is only 15% additional increase in the β -structure upon forming the tetramer.

To test the accuracy of our simulations, Fig. 5 compares the experimental and in silico fractions of β -structure. This comparison is facilitated by including the data for $A\beta$ fibril peptides determined experimentally or computed in our recent studies using the same simulation model ([Table 1\)](#page-3-0) [\(20,42\)](#page-8-0). Fig. 5 shows that the experimental and computational β contents $S^{\exp}(n)$ and $\langle S(n) \rangle$ are in good agreement for all available values of oligomer order n. This lends support to the in silico conformational ensembles obtained in our study.

It should be mentioned that CHARMM19+SASA model predicts higher helix content in $A\beta$ species (monomers through tetramers) than the experiments [\(20](#page-8-0)). There are two possible reasons for this discrepancy.

First, we use truncated $A\beta_{10-40}$ peptides, in which first nine N-terminal residues are deleted. Our previous study ([34\)](#page-9-0) has shown that the truncation results in 19% increase in the fraction of helix residues in the monomers (from 0.27 in $A\beta_{1-40}$ to 0.32 in $A\beta_{10-40}$.

Second, we cannot rule out that the SASA implicit solvent model overestimates the fraction of helix structure in $A\beta$ species due to approximate treatment of hydration effects. Hence, further studies will be needed to determine the exact cause of this discrepancy.

It is also important to comment on the experimental and in silico oligomer-size distributions. A continuous distribution of $A\beta$ species, from monomers to tetramers, is observed in the experiments (20). In our simulations, $A\beta$ dimers or tetramers are formed with the probability ~1.0. To resolve this difference, one needs to recall that the in vitro experiments probing $A\beta$ aggregation are performed at micromolar concentrations, whereas a millimolar $A\beta$ concentration is used in our study to accelerate sampling of aggregated states. Consequently, in simulations the thermodynamic equilibrium is expected to shift to higher order oligomers.

Qualitatively similar changes in the secondary structure were observed in the oligomers formed by α -synuclein ([48\)](#page-9-0). The Raman spectroscopy showed that the small α -synuclein oligomers possess significant amount of helix structure (47%), which decreases upon aggregation progression. Simultaneously, the fraction of β -sheet conformations grows from 29% in small oligomers to 54% in protofilaments. Therefore, the conversion of helix structure into β in the oligomers is likely to be a generic feature of aggregation.

A computational study relevant to our simulations has investigated the oligomers formed by human islet amyloid polypeptide (hIAPP) ([49\)](#page-9-0). It has been shown that hIAPP trimers do not contain parallel or antiparallel in-registry β -structure characteristic of seeded hIAPP fibrils. Moreover, in agreement with our data, implicit solvent MD study of $A\beta_{1-39}$ dimer also found no evidence of fibril-like conformations [\(30](#page-9-0)). Those findings are qualitatively consistent with our results on $A\beta$ oligomers.

SUPPORTING MATERIAL

Two figures and additional materials and methods are available at [http://](http://www.biophysj.org/biophysj/supplemental/S0006-3495(10)00852-0) [www.biophysj.org/biophysj/supplemental/S0006-3495\(10\)00852-0](http://www.biophysj.org/biophysj/supplemental/S0006-3495(10)00852-0).

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