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# Effect of a Paramagnetic Spin Label on the Intrinsically Disordered Peptide Ensemble of Amyloid- $\beta$

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ABSTRACT Paramagnetic relaxation enhancement is an NMR technique that has yielded important insight into the structure of folded proteins, although the perturbation introduced by the large spin probe might be thought to diminish its usefulness when applied to characterizing the structural ensembles of intrinsically disordered proteins (IDPs). We compare the computationally generated structural ensembles of the IDP amyloid- $\beta$ 42 (A $\beta$ 42) to an alternative sequence in which a nitroxide spin label attached to cysteine has been introduced at its N-terminus. Based on this internally consistent computational comparison, we find that the spin label does not perturb the signature population of the  $\beta$ -hairpin formed by residues 16–21 and 29–36 that is dominant in the  $A\beta 42$  reference ensemble. However, the presence of the tag induces a strong population shift in a subset of the original A $\beta$ 42 structural sub-populations, including a sevenfold enhancement of the  $\beta$ -hairpin formed by residues 27–31 and 33–38. Through back-calculation of NMR observables from the computational structural ensembles, we show that the structural differences between the labeled and unlabeled peptide would be evident in local residual dipolar couplings, and possibly differences in homonuclear <sup>1</sup>H-<sup>1</sup>H nuclear Overhauser effects (NOEs) and heteronuclear <sup>1</sup>H-<sup>15</sup>N NOEs if the paramagnetic contribution to the longitudinal relaxation does not suppress the NOE intensities in the real experiment. This work shows that molecular simulation provides a complementary approach to resolving the potential structural perturbations introduced by reporter tags that can aid in the interpretation of paramagnetic relaxation enhancement, double electron-electron resonance, and fluorescence resonance energy transfer experiments applied to IDPs.

## INTRODUCTION

Intrinsically disordered proteins (IDPs) are an important class of proteins that play a significant role in cellular functions as well as a deleterious role in diseases  $(1-3)$ . They confound the structure-function paradigm since they do not have a single dominant tertiary structure but instead sample between multiple tertiary conformations in solution. Paramagnetic relaxation enhancement (PRE) experiments are a widely used NMR technique employed to provide information about long-range order in both folded proteins ([4–6\)](#page-7-0) and more recently in IDP structural ensembles  $(7-16)$ . It requires the introduction of a nitroxide spin label into the peptide of interest via a covalent bond to cysteine residues, a technique commonly known as site-directed spin labeling [\(17](#page-7-0)). If the protein doesn't have a cysteine residue, then cysteine is added to the sequence either as a point

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mutation or as an additional residue. The benefit of adding the label is that the unpaired electron spin in the PRE tag causes additional dipole-dipole interactions that result in line broadening in the NMR spectrum, from which information about distances up to 25 Å between the probe and a desired site can be extracted.

Of course, the PRE tag attached to the cysteine residue is a relatively large side-group perturbation relative to the original sequence, whose structural consequences must be carefully quantified to extract useful structural information about the unlabeled system. For well-folded proteins, most available sequence sites are able to accommodate the addition of the spin label without any significant structural changes [\(4,5,18–20](#page-7-0)). On the other hand, IDPs are remarkably different from well-folded proteins because of their structural plasticity, such that it might be expected that point mutations, an addition of a single residue, or introduction of a spin label, might bring about extensive structural changes in the IDP ensemble. At present, however, most experiments on IDPs are analyzed under the assumption that the probe



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has only a localized effect on structure and dynamics, and that the corresponding long-range features of the untagged ensemble are minimally perturbed. The motivation behind this work is to have a better understanding of the effect of probe attachment to an IDP based on a comparison of its structural ensemble to the same IDP structural ensemble without a label, so that the PRE experiments on IDPs are interpreted correctly.

Here, we study the effects of the PRE spin label on the structural dynamics of the amyloid- $\beta$  peptide (A $\beta$ 42), a 42-residue peptide that is the major molecular player in Alzheimer's disease ([21,22](#page-7-0)). It has been widely studied both experimentally  $(11-13,21,23-25)$  and computationally ([26–37\)](#page-8-0) and the results show that the monomeric form of  $A\beta$ 42 is classified as an IDP, sampling among an extensive set of conformations in solution. We chose  $A\beta$ 42 for our study because our previous computational work has characterized its structural ensemble extensively [\(34–36](#page-8-0)) and we have made thorough comparisons to the experimental and computational work of others [\(23,38–40](#page-8-0)). In this work, we have combined two different sampling techniques replica-exchange molecular dynamics [\(41](#page-8-0)) (REMD) and temperature cool walking [\(42,43\)](#page-8-0) (TCW) to generate structural ensemble averages with error bars that take into account sampling uncertainty. We have performed two independent simulations of the untagged monomeric  $A\beta 42$  peptide and a tagged version of the  $A\beta$ 42 peptide in which we add a cysteine residue to the beginning of the N-terminus to which we attach the methanethiosulfonate spin label (MTSL) (Fig. 1), a commonly used spin label for PRE experiments. Any structural differences between the computationally generated ensembles of  $A\beta 42$  and MTSL-Cys- $A\beta$ 42 peptides that falls outside sampling uncertainty would then allow us to determine whether the spin label changes the IDP structural characteristics relative to the reference ensemble in any significant way.

From this internally consistent computational comparison we find that most of the important structural features of the untagged  $A\beta$ 42 ensemble have been preserved, such as the dominant  $\beta$ -hairpin between the central hydrophobic cluster (CHC) comprising residues 16–21 and the C-terminal residues 29–36 ([34–36\)](#page-8-0), which is likely critical for subsequent fibril formation. However, the spin label introduces strong



FIGURE 1 Schematic of MTSL. MTSL is a commonly used PRE tag because of its sulfhydryl specificity and side-chain flexibility. The oxygen atom is the paramagnetic center. To see this figure in color, go online.

population shifts toward greater enhancement of what were originally lightly populated  $\beta$ -hairpins in the C-terminal region, including a sevenfold enhancement of the  $\beta$ -hairpin formed by residues 27–31 and 33–38 that is largely driven by the hydrophobic character of the MTSL label. Through back-calculation of many types of NMR observables, our computational results would be supported by differences in residual dipolar couplings, and possibly differences in homonuclear <sup>I</sup>H-<sup>1</sup>H nuclear Overhauser effects (NOEs) and heteronuclear  ${}^{1}H-{}^{15}N$  NOEs, if the paramagnetic contribution to the longitudinal relaxation does not suppress the NOE intensities of these nuclei in the real experiment. We conclude that PRE experiments can be used to answer structural and mechanistic questions regarding IDP ensembles, when carefully interpreted with the aid of additional experiments combined with high-quality molecular simulations.

#### METHODS

Here, we report briefly on the simulation protocol and analysis methods; further details can be found in previous publications [\(34–36,42](#page-8-0)).

#### REMD simulation protocol

All simulation setup and production runs utilized Amber14 ([44\)](#page-8-0). For addition of the PRE-tag, a Cys residue was first added to the N-terminus of the  $A\beta$ 42 sequence, and the MTSL spin label was then attached through a disulfide bond at the  $C_\beta$  position of Cys0 of the Cys-A $\beta$ 42 peptide. The Cys residue was introduced in the N-terminus to be consistent with the PRE experimental protocol reported by Fawzi et al. [\(11](#page-7-0)). The peptides were modeled using the Amberff99sb force field [\(45,46](#page-8-0)) and the water molecules using the TIP4P-Ew water model [\(47](#page-8-0)). The parameters for the MTSL tag were generated using the CHAMBER module of Amber by Xue and Skrynnikov ([48\)](#page-8-0), a protocol that yields a consistent force field with the standard unlabeled peptide.

We created two extended configurations for  $A\beta 42$  and the MTSL-Cys- $A\beta42$  peptides, and the peptides were subsequently minimized. The initial simulation boxes were  $\sim$ 700 nm<sup>3</sup> in volume, and 3 and 4 Na<sup>+</sup> atoms were added to the simulation box to neutralize the peptide for the untagged  $A\beta$ 42 and MTSL-Cys-A $\beta$ 42, respectively. The starting configurations were heated to 287 K at constant volume and equilibrated for 2 ns under constant pressure of 1 bar, to achieve the correct density. This was followed by a 2 ns high-temperature simulation at 500 K to obtain a more collapsed peptide. Two distinct collapsed states were chosen for each peptide to start two independent REMD simulations. The peptides were resolvated to obtain cubic simulation boxes of 239 and 257  $\text{nm}^3$  for A $\beta$ 42 and MTSL-Cys- $A\beta42$  peptides, respectively. The final numbers of water molecules for the A $\beta$ 42 and MTSL-Cys-A $\beta$ 42 boxes were 7800 and 8372, respectively.

The REMD module of the Amber14 MD package was used to generate the structural ensembles. Fifty-eight replicas were used in the temperature range 287–450 K with an exchange probability of 18–22% and an exchange attempt of 0.5 ps. The production runs were performed in NVT ensemble using a 1 fs time step and with constraints on the heavy-atom hydrogen covalent bonds. A Langevin thermostat was used to regulate the temperature. Long- range electrostatic forces were calculated using particle-mesh Ewald with a 9.0 Å cutoff for the real-space electrostatics and Lennard-Jones forces. The total length of each simulation was 100 ns, with the first 50 ns being discarded as equilibration; the final Boltzmann weighted ensemble consisted of 10,000 structures from the final 50 ns of the two independent equilibrated simulations at 287 K.

#### TCW simulation protocol

TCW is a non-equilibrium alternative to REMD, using only two temperature replicas to generate a Boltzmann-weighted ensemble ([43\)](#page-8-0). Structures from the high temperature are sequentially cooled to the low temperature and detailed balance is satisfied based on corresponding heating runs that together comprise a complete Metropolis acceptance criterion. TCW has been shown in a previous publication to converge faster for small peptides such as alanine dipeptide, met-enkephalin, and also the  $A\beta42$  peptide ([42\)](#page-8-0). The same equilibrated starting structures for REMD simulations were chosen for the TCW method. The high- and low-temperature replicas were at 456.2 and 287 K with 50 intermediate annealing steps. Temperature was maintained using an Andersen thermostat [\(49](#page-8-0)). Long-range electrostatic forces were calculated using Ewald, with a cutoff of 9.5 Å for the real-space electrostatics and Lennard-Jones forces. The frequency of exchange attempt was 500 fs. Similar to the REMD simulations, two independent simulations were performed for 100 ns with only the last 50 ns being used for analysis.

#### Trajectory analysis

Both the cpptraj module of Amber and our own in-house codes for evaluating NMR observables were used for analyzing the structural ensemble properties of A $\beta$ 42 and MTSL-Cys-A $\beta$ 42. For the analysis, the cysteine residue of the modified MTSL-Cys-A $\beta$ 42 peptide will be referred to as Residue 0. The radius of gyration  $(R_g)$  was calculated using backbone heavy atoms for residues Asp1–Ala42; secondary structures were assigned using the Dictionary of Secondary Structure Prediction criterion; and hydrogen bonds were calculated using distance cutoffs of 3.5 and 4.0 Å, respectively, between heavy atoms and a  $60^\circ$  angle cutoff for both.

#### Calculation of NMR observables

Full details for back calculation of NMR observables have been reported in previous publications, including chemical shifts from ShiftX2  $(50)$  $(50)$ , J-coupling constants ([51\)](#page-8-0), residual dipolar couplings (RDCs) based on local [\(52](#page-8-0)) and global alignments [\(53](#page-8-0)), and  ${}^{1}H-{}^{1}H$  and  ${}^{1}H-{}^{15}N$  NOEs ([34,35\)](#page-8-0) from the 287 K structural ensembles and MD correlation [\(34,35](#page-8-0)) times for both the tagged and untagged peptide. We give a brief summary here for homonuclear and heteronuclear NOE intensities.

We performed short NVE simulations to calculate the spectral density functions (which are related to the NOE peak intensity). The normalized correlation function for each pair of hydrogen atoms in the  $A\beta$  peptides is calculated using the equation

$$
C(\tau) = \left\langle \frac{1}{r^6(t)} \right\rangle^{-1} \left\langle \frac{P_2(\cos \chi_{t,t+\tau})}{r^3(t)r^3(t+\tau)} \right\rangle, \tag{1}
$$

where  $r(t)$  is the vector between each hydrogen-atom pair at time t,  $\chi_{t,t + \tau}$  is the angle between the  $r(t)$  and  $r(t + \tau)$  vectors, and  $P_2$  is the second-order Legendre polynomial. Each correlation function is then fitted to a multiexponential form over a 5 ns range to obtain  $\tau$ .

$$
C(\tau) \approx \sum_{i=1}^{N} a_i e^{-t/\tau_i},
$$
 (2)

with  $N = 1, 2, 3$ , or 4, and

$$
\sum_{i=1}^N a_i = 1
$$

The resulting time correlation function is then Fourier-transformed,

$$
J(\omega) = \int_{-\infty}^{\infty} C(\tau) e^{i\omega \tau} d\tau, \tag{3}
$$

to obtain

$$
J(\omega) = \sum_{i=1}^{N} \left[ a_i \frac{2\tau_i}{1 + \omega^2 \tau_i^2} \right],
$$
 (4)

where  $\tau_i$  corresponds to the correlation time constant,  $\tau_i$ .

The final step in homonuclear NOE calculation is to obtain the relaxation matrix R, composed of diagonal elements,

$$
\rho_{ii} = \sum_{j=1 \neq i}^{n} \frac{1}{10} K^2 \left[ 3J_{ij}(2\omega_0) + \frac{3}{2} J_{ij}(\omega_0) + \frac{1}{2} J_{ij}(0) \right] \quad (5)
$$

and off-diagonal elements,

$$
\sigma_{ij} = \frac{1}{10} K^2 \left[ 3J_{ij}(2\omega_0) - \frac{1}{2} J_{ij}(0) \right]. \tag{6}
$$

The intensity obtained for each nucleus in the NOE spectra directly relates to the magnitudes in the matrix R.

A method similar to that employed above was used to calculate the spectral density function for each pair of H-N atoms for the H-N backbone bond for each residue in A $\beta$ 42. The steady-state NOE enhancement factor of the <sup>1</sup>H NOE was then estimated using the equation

$$
\varepsilon_{\text{NOE}} = 1 + \frac{\gamma_{\text{H}} \sigma_{\text{HN}}}{\gamma_{\text{N}} R_z^{(N)}},\tag{7}
$$

where  $\gamma_H$  and  $\gamma_N$  are the gyromagnetic ratios of <sup>1</sup>H and <sup>15</sup>N, respectively.<br>The <sup>1</sup>H <sup>15</sup>N cross relaxation rate constant is defined as The  ${}^{1}H-{}^{15}N$  cross-relaxation rate constant is defined as

$$
\sigma_{\rm HN} = \frac{1}{10} K^2 \bigg[ 3J_{ij}(\omega_{0,\rm H} + \omega_{0,\rm N}) - \frac{1}{2} J_{ij}(\omega_{0,\rm H} - \omega_{0,\rm N}) \bigg] \quad (8)
$$

and the <sup>15</sup>N self-relaxation as

$$
R_z^{(N)} = \frac{1}{10} K^2 \left[ \frac{3}{2} J_{ij}(\omega_{0,N}) + 3 J_{ij}(\omega_{0,H} + \omega_{0,N}) + \frac{1}{2} J_{ij}(\omega_{0,H} - \omega_{0,N}) \right],
$$
\n(9)

where  $\omega_{0,H}$  is the Larmor frequency of <sup>1</sup>H and  $\omega_{0,N}$  is the Larmor frequency of <sup>15</sup>N. The constant factor K is given as of  $15N$ . The constant factor K is given as

$$
K\frac{\mu_0}{4\pi r_{\rm eff}^3} \hbar \gamma_{\rm H} \gamma_{\rm N},\tag{10}
$$

where  $\hbar$  is Planck's constant and  $\mu_0$  is the permeability of free space.

#### RESULTS

The characterization of an IDP structural ensemble is a highly underdetermined problem when compared to that of the folded-protein class, and thus, it is paramount to quantify the errors in computational reproducibility through independent ensemble calculations of the same IDP sequence. This is necessary to ensure that a fair comparison is made as to whether there are meaningful structural ensemble differences between the IDP  $A\beta$ 42 and MTSL- $Cys-A\beta42$  peptides that arise from perturbations due to the spin label versus what arises from intrinsic uncertainties due to sampling limitations of the IDP ensemble. Although errors in force fields may contribute to direct agreement with experiment, use of the same protein and water force fields (Amberff99sb force field ([45,46](#page-8-0)) and TIP4P-Ew water model ([47\)](#page-8-0)) provides an internally consistent comparison among the computationally generated ensembles.

We therefore have performed two independent de novo MD simulations of the  $A\beta$ 42 and MTSL-Cys-A $\beta$ 42 peptides using standard REMD  $(54–56)$  $(54–56)$  and also two independent TCW simulations of the two peptides in this work. Together, these independent ensembles provide a measure of reproducibility between computationally generated IDP ensembles, such that the standard deviation among them defines the uncertainty due to the sampling protocol. With the calculated model uncertainties thus defined as a standard deviation in all properties of the  $A\beta42$  reference ensemble, any structural ensemble differences that are larger than this intrinsic sampling error when comparing against the  $MTSL-Cys-A\beta42$  ensemble would thus define a genuine perturbation to the structural sub-populations due to the spin label.

Fig. 2 shows the normalized probability density distributions of the radius of gyration  $(R_g)$  in the A $\beta$ 42 and MTSL-Cys-A $\beta$ 42 ensemble. The mean and STD values in the  $R_{g}$ for the  $A\beta 42$  averaged ensembles and the MTSL-Cys- $A\beta$ 42 ensembles are 12.1  $\pm$  2.1 and 11.6  $\pm$  1.3 Å, respectively. All untagged  $A\beta$ 42 ensembles are qualitatively the same in the sense that each exhibits a longer tail in the  $R_{g}$ distribution compared to the tagged peptide. The MTSL-



FIGURE 2 Probability distribution of the radius of gyration of the simulated  $A\beta42$  (dash-dotted line) and MTSL-Cys-A $\beta42$  (solid line) ensembles. To see this figure in color, go online.

 $Cys-A\beta42$  ensemble has slightly more compact distribution than the  $A\beta 42$  ensemble, but there is enough uncertainty in the  $R_g$  estimates that we need to consider other types of analysis of their structural characteristics to quantify the effect of the spin label on the observed sub-populations of structure.

Fig. 3 shows the propensities by residue for each peptide to form helical structures ( $\alpha$ -helix, 3–10 helix, and  $\pi$ -helix),  $\beta$ -structure (intramolecular  $\beta$ -bridges,  $\beta$ -hairpins, or  $\beta$ -sheets), and localized turns (with and without hydrogen bonds), as averages over their conformational ensembles. [Table 1](#page-4-0) provides the subset of secondary-structure classifications in Fig. 3 that are supported by internal hydrogen bonds (according to the Dictionary of Secondary Structure Prediction ([57\)](#page-8-0)), which would likely comprise secondarystructure sub-populations that are typically more populated due to greater Boltzmann weighting. It is important to note we have combined populations of turns and helices at the same sequence positions since any helical structure is typically localized to only one turn.

When [Table 1](#page-4-0) and Fig. 3 are considered together, it is evident that many of the secondary-structure sub-populations are quantitatively preserved between the  $A\beta42$ and MTSL-Cys-A $\beta$ 42 ensemble. The reference peptide has a large number of highly populated turns and helices throughout the sequence (Fig. 3), whose population percentages are almost completely explained by their stabilization due to internal hydrogen bonds ([Table 1\)](#page-4-0). The most prominent  $\beta$ -hairpin structure in the original A $\beta$ 42 ensemble is formed by  $\beta$ -strand pairings between the CHC and residues



FIGURE 3 Percentage of simulated  $A\beta$ 42 (*dotted line*) and MTSL-Cys- $A\beta$ 42 (solid line) ensembles involved in different types of secondary structure:  $\alpha$ -helix (top),  $\beta$ -bridges or  $\beta$ -strands (middle), and turns (bottom). Standard deviations are based on differences between the two ensembles generated from REMD and TCW sampling. To see this figure in color, go online.

<span id="page-4-0"></span>



The asterisks indicate the structural features whose populations differ in the untagged and tagged ensembles by a larger standard deviation than that observed for REMD and TCW ensembles of the  $A\beta42$  ensemble.

29–36, sometimes stabilized by turns in the residue region Ala21–Gly25, such that the overall percentage of this  $\beta$ -hairpin averaged across all untagged A $\beta$ 42 ensembles is  $\sim$ 9% [\(34–36](#page-8-0)). Although we find that the MTSL-Cys- $A\beta$ 42 structural ensemble stabilizes this  $\beta$ -hairpin at close to 18%, this population of  $\beta$ -hairpin is largely preserved within statistical uncertainty compared to the reference ensemble. Even so, this  $\beta$ -hairpin is not present in the simulated  $A\beta40$  ensemble, and so the fact that it is retained in the labeled  $A\beta$ 42 peptide is encouraging for preserving one of the primary structural differences between the two  $A\beta$  peptides.

However, there are some substantial shifts from the subpopulation percentages seen for the unlabeled peptide in the C-terminal regions of the sequence due to the spin label. The reference  $A\beta 42$  ensemble exhibits two additional small sub-populations, 1) an anti-parallel  $\beta$ -strand pairing between residues 27–31 and 33–38 in  $\sim$ 5% of the ensemble, and 2), an N-terminal turn  $1-2/2-3$  present in  $\sim$ 4% of the ensemble. The percentages within these sub-populations shift dramatically in the presence of the MTSL-Cys addition to the N-terminus. Although the perturbation in the turn population in the N-terminus might be expected, what is the most striking effect of the spin label is the greater enhancement in the population of the  $\beta$ -hairpin population ( $\sim$ 38%), stabilized by  $\beta$ -turn 32–33. (Fig. S1). There is a simultaneous decrease in the turn content in the neighboring residues (turn 30–31/31–32/33–34) to accommodate the increased  $\beta$ -turn propensity of residues 32–33. This increase in secondary-structure content is largely driven by the hydrophobic interactions of the spin label with many residues along the chain (Fig. 4), which introduces a new long-range interaction between



FIGURE 4 Representative configuration of the MTSL-Cys-A $\beta$ 42 ensemble, showing increased side-chain interactions between MTSL-Cys and Leu34 and Met35, which contributes to a more collapsed structural ensemble and  $\beta$ -strand pairings (*darker shade*) between residues 29– 32and 36–38. This new  $\beta$ -structure is present in negligible amounts in the untagged peptide. Chimera ([\(73](#page-9-0)); University of California, San Francisco) was used to generate the molecular graphics. To see this figure in color, go online.

the N- and C-terminus of the MTSL-Cys- $A\beta$ 42 peptide that contributes to a more collapsed ensemble, corroborated by the  $R_{\rm g}$  data.

Fig. 5 shows a heavy-atom contact map that averages over the  $A\beta$ 42 and MTSL-Cys-A $\beta$ 42 structural ensembles; although the overall pattern of residue-residue contacts are similar in the two sequences, the MTSL-Cys residue is involved in long-range heavy-atom contacts with residues 9–42 in >90% of the ensemble that explain these population shifts (Fig. S2). Considering the hydrophobic nature of the tag, a basic intermolecular interaction that is captured more than adequately by the force fields used here, the differences between the  $A\beta$ 42 and MTSL-Cys-A $\beta$ 42 cannot be attributed wholesale to non-optimized force-field parameters but instead would be expected to give rise to the changes observed here. Thus, our observations of strong population shifts arising in the MTSL-Cys- $A\beta$ 42 ensemble can be tested experimentally.

However, we require a set of NMR observables that might reveal their structural differences. We have previously found



FIGURE 5 Heavy-atom contact map of the simulated ensembles of  $A\beta 42$ (top) and MTSL-Cys-A $\beta$ 42 (bottom). The contact maps portray the probability of interactions between each pair of residues in the simulated monomer ensembles. A contact is represented between two residues if any of their heavy atoms are  $\leq$  5 Å apart, and it is averaged over the ensemble to represent it with a probability ranging from 0 (black) to 1 (white). To see this figure in color, go online.

that chemical shifts, J-couplings, and global RDCs are not sufficiently discriminating NMR observables to differentiate between IDP ensembles for  $A\beta40$  versus  $A\beta42$ , and Figs. S3–S5 confirm that these observables are not particularly helpful for discerning differences between  $A\beta$ 42 and  $MTSL-Cys-A\beta42$ . However, we have previously found that local RDCs introduced by the Forman-Kay group  $(58)$  $(58)$ , as well as homonuclear  ${}^{1}H-{}^{1}H$  NOEs and heteronuclear  ${}^{1}$ H $-{}^{15}$ N NOEs, were found to better aid in the discrimination between different ensembles for A $\beta$ 40 versus A $\beta$ 42 ([35\)](#page-8-0). Fig. 6 shows the local  ${}^{1}D_{NH}$  RDCs back-calculated from the untagged and tagged ensembles. It is evident that the local  ${}^{1}D_{NH}$  values are larger on average in the presence of the spin label, where the RDC differences between the untagged and tagged peptide are larger than the experimental error of  $0.1-0.6$  Hz reported for A $\beta$ 42. Thus, we would predict that the  ${}^{1}D_{NH}$  RDCs would have enough signal above the highly averaged conformational background to detect these  $\beta$ -hairpins.

[Fig. 7](#page-6-0) compares the  $15N$  NOE enhancement factor for REMD simulations of the  $A\beta$ 42 and MTSL-Cys-A $\beta$ 42 ensembles. Although the trend is similar in both the ensembles, the MTSL-Cys-A $\beta$ 42 ensemble has higher NOE intensity values, indicating that the backbone is more ordered, essentially over the entire peptide. The experimental uncertainty for  $A\beta 42$  <sup>15</sup>N NOE enhancement varies between 0.006 and 0.08 based on data reported by Yan and Wang ([23\)](#page-8-0). Thus, we expect  $^{15}N$  NOE experiments to capture the differences in the tagged and untagged peptide observed in the simulations. In our simulated homonuclear NOE peaks for the  $A\beta42$  and MTSL-Cys- $A\beta42$  ensembles, we find that the additional structure in the C-terminal region manifests as additional NOEs in the spin-labeled peptide (Fig. S6). That said, it should be noted that the unpaired



FIGURE 6 Calculated local residual dipolar couplings for  $A\beta 42$  and  $MTSL-Cys-A<sub>\beta</sub>42$ . Results are generated based on local alignments using the ENSEMBLE software package ([58\)](#page-8-0).

<span id="page-6-0"></span>

FIGURE 7 Comparison of the simulated <sup>1</sup>H-<sup>15</sup>N NOE enhancement for  $A\beta$ 42 (dotted line) and MTSL-Cys-A $\beta$ 42 (solid line) from REMD simulations. Higher values in the tagged peptide support a more ordered backbone. To see this figure in color, go online.

electron in the PRE tag present in the MTSL-Cys- $A\beta$ 42 ensemble has a paramagnetic contribution to the longitudinal relaxation of the nuclei of interest, and typically dominates the relaxation process such that the underlying NOEs are very diminished in the real experiment ([19\)](#page-7-0). Since we do not consider the paramagnetic relaxation component for the NOE calculations for the MTSL-Cys- $A\beta$ 42 ensemble, further experimental judgment is required regarding whether the  ${}^{1}H$  and  ${}^{15}N$  NOE features would have sufficient strength to be observed.

#### **DISCUSSION**

Our results showing that structural perturbations are inevitable due to the addition of a spin label are supported by a number of previous PRE studies on folded proteins as well as IDPs. Although for well-folded proteins most sites are able to accommodate the addition of a paramagnetic tag like MTSL without any significant structural changes  $(18,59,60)$  $(18,59,60)$ , both computational  $(20)$  $(20)$  and experimental studies  $(4)$  $(4)$  on the folded state of cytochrome c did show a slight decrease in protein helicity after probe attachment. In the study by Kjaergaard et al. [\(14](#page-7-0)) on the disordered activator for thyroid hormone and retinoid receptors peptide, the authors observed a 3–7% increase in the populations of existing helical segments after introduction of the MTSL spin label, although they considered the perturbations not strong enough to influence their conclusions about long-range interactions between the targeted set of helical domains. MTSL and TEMPOL, a different PRE tag, have been shown to have high affinity toward hydrophobic surfaces [\(61,62\)](#page-8-0), and the increased surface interaction in turn induces more aggregation in the labeled peptide ([12\)](#page-7-0). Finally, another way of conducting PRE experiments is to introduce small sequence motifs that bind to paramagnetic metal ions like  $Cu^{2+}$ , Ni<sup>2+</sup>, or lanthanide ions, but these methods are not popular for IDP experiments, because they require larger sequence modification if the motif is not present in the original protein and would certainly perturb the underlying structural ensemble significantly ([63\)](#page-8-0).

However, the question is what can be learned from PRE experiments when applied to IDPs in solution, despite the inevitable perturbations due to the tag. In light of the simulation results presented here, PRE experiments aimed at looking into the kinetics of fibril or oligomer-growth mechanisms of A $\beta$ 42 (or A $\beta$ 40 peptide ([11\)](#page-7-0)), or interactions with membranes [\(64](#page-8-0)), should be analyzed with caution. Fibrils usually elongate by a faster ''dock'' and slower ''lock'' mechanism ([65\)](#page-8-0), and the tagged peptide might take longer to properly lock because of the introduction of free-energy barriers associated with the new/enhanced  $\beta$ -structure assemblies. For smaller oligomeric intermediates, the paramagnetic tag will possibly introduce more structured, compact conformations and increase the aggregation rates. The enhanced structure formation appears to arise from excessive hydrophobicity of the MTSL label that could be reduced by using a modified MTSL tag designed to be more hydrophilic [\(66,67\)](#page-9-0). This is a welcome addition given the importance of experiments such as PRE that can probe long-range order in IDP structures in solution, although a similar study to this one would be needed to help quantify the structural ensemble perturbations introduced by the more hydrophilic label.

#### **CONCLUSION**

The most widely used method for gaining detailed structural insights into IDPs is to combine experimental techniques such as NMR, infrared spectroscopy, and small-angle x-ray scattering with computational techniques like MD, Monte Carlo simulations, or knowledge-based methods ([36,68–70\)](#page-8-0). The experimental observables are typically used to either validate IDP structural ensembles that are generated from Boltzmannweighted MD simulations  $(26,30,34-36)$ , to select for conformations from computationally generated IDP (typically random coil) ensembles ([58,68,69](#page-8-0)), to provide structural restraints during guided MD simulations  $(7,8,68,71)$  $(7,8,68,71)$ , or to use in Bayesian analysis [\(72](#page-9-0)). Here, we have utilized molecular simulations to predict the perturbations caused by addition of the commonly used MTSL tag in PRE experiments when applied to the disordered  $A\beta$ 42 peptide.

We have employed several independent calculations of the structural ensemble of the native  $A\beta$ 42 ensemble to provide estimates of uncertainty due to sampling protocol to distinguish real structural perturbations measured from the average of two independently generated ensembles of the labeled MTSL-Cys-A $\beta$ 42 peptide. To sum up the effects of the spin label, a majority of the main structural features of the peptide, including the dominant  $\beta$ -hairpin formed by residues 16–21 and 29–36 ([34,36](#page-8-0)), are able to withstand <span id="page-7-0"></span>the perturbations introduced by the tag. Nevertheless, the tag causes population enhancements in the C-terminus involving the  $\beta$ -hairpin formed by residues 27–31 and 33–38. If  ${}^{1}$ H and  ${}^{15}$ N NOE experiments can be performed without the paramagnetic spin label dominating the relaxation mechanisms, experiments would point toward a more ordered backbone and new NOE peaks arising from the enhanced/new  $\beta$ -strand contacts. Our results will also be supported by RDC experiments in which local alignments are considered [\(58](#page-8-0)), which will show increased  ${}^{1}D_{NH}$  values resulting from higher  $\beta$ -structure propensities, especially in the C-terminus.

In conclusion, PRE experiments, fluorescence resonance energy transfer, and double electron-electron resonance experiments can probe long-range order in polypeptide structures in solution, although the requirement of a reporter tag will likely perturb the underlying structural ensemble to some degree  $(7,8,63)$ . Furthermore, the nature of the structural perturbation will vary with peptide size, sequence, tag type and position, and whether it is being used to probe a folded or disordered structural ensemble. Since quantifying the exact extent of the perturbations caused by the spin label can be difficult to determine experimentally, we believe that MD simulation is a powerful and complementary approach to resolving the potential structural perturbations and that it will suggest experiments that can confirm the theoretical predictions.

#### SUPPORTING MATERIAL

Six figures are available at [http://www.biophysj.org/biophysj/supplemental/](http://www.biophysj.org/biophysj/supplemental/S0006-3495(17)30758-0) [S0006-3495\(17\)30758-0.](http://www.biophysj.org/biophysj/supplemental/S0006-3495(17)30758-0)

### AUTHOR CONTRIBUTIONS

T.H.-G. proposed the project and approach. S.S. and J.L. performed the simulations. S.S., J.L., and T. H.-G. analyzed the data. S.S. and T.H.-G. wrote the manuscript.

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