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# Insights into Conformational Ensembles of Compositionally Identical Disordered Peptidomimetics

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While the conformational ensembles of disordered peptides and peptidomimetics are complex and challenging to characterize, they are a critical component in the paradigm connecting macromolecule sequence, structure, and function. In molecules that do not adopt a single predominant conformation, the conformational ensemble contains rich structural information that, if accessible, can provide a fundamental understanding related to desirable functions such as cell penetration of a therapeutic or the generation of tunable enzyme-mimetic architecture. To address the fundamental challenge of describing broad conformational ensembles, we developed a model system of peptidomimetics comprised of polar glycine and hydrophobic *N*-butylglycine to characterize using a suite of analytical techniques. Using replica exchange molecular dynamics atomistic simulations and liquid chromatography coupled to ion mobility spectrometry, we were able to distinguish the conformations of compositionally identical model sequences. However, differences between these model sequences were more challenging to resolve with characterization tools developed for intrinsically disordered proteins and polymers, including double electron-electron resonance (DEER) spectroscopy and diffusion ordered spectroscopy (DOSY) NMR. Finally, we introduce a facile colorimetric assay using immobilized sequences that leverages a solvatochromic probe, Reichardt's dye, to visually reveal conformational trends consistent with the experimental and computational analysis. This rapid colorimetric technique provides a complementary method to characterize the disorder of macromolecules and examine conformational ensembles as an isolated or multiplexed technique.

# 1 Introduction

Disordered oligomers play critical roles in natural systems of biomolecules, but their conformational complexity exists beyond the classical structure-function paradigm.<sup>1-3</sup> Highlyordered biopolymers such as folded protein domains, which access only a handful of conformations, are well-characterized with existing techniques such as crystallography and cryogenic electron microscopy, resulting in fundamental design principles connecting primary sequences with folded structures. However, the complex conformational and energetic landscapes of disordered biopolymers and synthetic oligomers are poorly understood (Figure 1a).<sup>1,2,4,5</sup> Establishing similar design principles for these materials demands techniques that can readily capture conformational dispersity. Currently, there are limited experimental strategies available to capture these distributions and enable sensitive detection of the subtle differences between compositionally identical macromolecules

that differ only in sequence.<sup>5,6</sup> Developing sequence-structure and structure-function relationships for oligomers is essential for advancing next generation biomaterials and therapeutics.<sup>6–</sup>

Current techniques have both advantages and limitations when implemented for the characterization of small (<3 kDa) macromolecules (Figure 1b). Ensemble averaging can present a challenge for many methods utilized for characterization and comparison of small, disordered macromolecules with similar compositions. Synthetic polymers can be successfully characterized by dynamic light scattering and size exclusion chromatography, but these methods provide poor resolution for smaller scaffolds. Circular dichroism and infrared spectroscopies are compatible with smaller scaffolds; however, they only reveal secondary structure and cannot fully describe the structure of disordered oligomers that lack a chiral moiety or regions of local structure.<sup>11,12</sup> Small angle x-ray and neutron scattering (SAXS, SANS) are used to characterize the morphology of macromolecules with diameters from tens to hundreds of nanometers, yet they suffer from limited resolution at small radii.<sup>13,14</sup> Solution NMR methods such as diffusion ordered spectroscopy (DOSY)<sup>15</sup> are capable of revealing conformational profiles of disordered macromolecules; however, these methods are time intensive and can require an amount of material that limits throughput and accessibility (> 0.5 mg). Ion mobility spectrometry (IMS) can probe small amounts of material; however, it has only recently been

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immobilized peptidomimetic in biomimetic solution

colorimetric assay visualized by optical microscopy

**Figure 1.** Overview of the continuum of disorder for peptidomimetics and methods for structural characterization. a) Scope of structural disorder of sequence-defined oligomers. b) Existing methods for characterizing oligomers, where  $R_{ee}$  denotes the end-to-end distance of the chain. Time intensive techniques typically require > 20 min (X), > 2 h (XX); material intensive typically require > 10  $\mu$ g (X), > 0.5 mg (XX); and small size scales refers to materials smaller than 3 kDa. c) Schematic of the colorimetric platform for characterizing

implemented in the characterization of macromolecular conformation.<sup>16</sup> Techniques that probe end-to-end distance, including double electron-electron resonance (DEER) spectroscopy, analyze a distribution of conformations; however, this can be time intensive and offer limited resolution outside of 2-8 nm.<sup>17</sup> Each effort at the frontier of analytical characterization can reveal unique descriptors of the conformational landscape but rarely capture its full extent. To supplement experimental characterization, atomistic simulations can provide detailed information about the conformational distribution but are computationally intensive.<sup>18</sup> Therefore, the pursuit of a comprehensive understanding of conformational complexities demands a diverse suite of characterization methods.

Peptoids, *N*-substituted glycine oligomers, serve as an excellent model scaffold for elucidating the complementary capabilities of conformational characterization techniques. Peptoids can mimic the structure and function of proteins by adopting compact morphologies and secondary structures, enabling the development of functional materials including therapeutics,<sup>20,21</sup> catalysts,<sup>22,23</sup> devices encoding information,<sup>24</sup> and biomolecule receptors.<sup>25–27</sup> While peptoid sequences can form helices<sup>28–31</sup> and nanosheets,<sup>27,32</sup> side-chains can be selected that do not form secondary structure,<sup>17,33–37</sup> allowing the isolation of variables such as the patterning of charged<sup>31,36</sup> or hydrophobic<sup>33,38</sup> residues, and their impact on conformation.

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The conformational distribution of four peptoids with unique hydrophobic patterning is characterized herein using a combination of complementary computational and experimental techniques, including a versatile colorimetric assay. Atomistic simulations provide high-resolution insights, while experimentally, IMS, DOSY NMR, and DEER spectroscopy provide complementary insights into the peptoids' conformational distributions. To supplement existing structural characterization methods for disordered oligomers, we developed a versatile colorimetric assay using a solvatochromic dye and broadly accessible instrumentation (Figure 1c). Solvatochromic dyes<sup>39,40</sup> have been used for various applications, such as staining hydrophobic regions in proteins<sup>41</sup> and intracellular lipid droplets,<sup>42</sup> monitoring biomacromolecular interactions, 43,44 visualizing molecular weight differences in supramolecular polymers,<sup>45</sup> in addition to characterizing the hydrophobic microenvironments of synthetic dendrimers,<sup>46</sup> surfaces,47 single-33,48 and multichain assemblies.<sup>49–52</sup> Dyes have probed peptoid self-association<sup>49,52–</sup> <sup>56</sup> and resolved differences in the conformations of a disordered and a protein-mimetic 100mer peptoid<sup>33</sup> inspiring the implementation of a solvatochromic dye with our immobilized assay. This assay similarly leverages the polarity responsiveness of a solvatochromic dye, Reichardt's dye, to visually reveal multiple classifications of disorder for disordered peptoid oligomers. Our results corroborate differences observed by the aforementioned analytical techniques, ultimately enabling facile characterization of single-chain disorder and compactness of oligomeric sequences, adding a valuable tool to the characterization toolbox for complex conformational landscapes.

## 2 Results and discussion

#### 2.1 Design of model HP peptoids

We designed four peptoids with identical compositions and varied sequences to target conformational differences independent of composition (Figure 2a), as patterns of



**Figure 2.** Sequence workflow and design. a) Schematic describing the 20mer peptidomimetics with identical compositions (left) and monomer structures (right): hydrophobic (N-butylglycine) and polar (glycine). b) Schematic describing use of solid-phase synthesis to prepare 20mers for characterization of disorder.

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hydrophobic residues are critical in protein and macromolecular conformation.57,58 Hydrophobic patterning has been demonstrated to yield differences in conformation with previous HP models where "H" describes a hydrophobic residue and "P" describes a polar residue in both experimental characterization with larger macromolecules (e.g., 100mer peptoids) and macromolecule simulations.<sup>33,59–62</sup> We selected *N*-butylglycine for the hydrophobic monomer and chose glycine as a contrasting, more polar residue with an efficient incorporation enabling high-yielding oligomer synthesis. This system enables the isolation of one side-chain interaction, hydrophobic collapse, without extraneous variables such as charge or aromaticity. Monomers were chosen to promote disordered solution-phase structures that lack significant secondary structure; thus, conformations are predominantly driven by hydrophobic collapse. Even compact peptoids in this space are likely to be highly disordered, similar to molten globule proteins.63,64 These residues were arranged into peptoids of 20 monomers in length (20mers; Figure 2a and S1), which are short enough to achieve high-purity syntheses, long enough to yield conformations with different degrees of disorder.<sup>7,60,65</sup> Further, these are similar in length to approved peptide therapeutics (e.g., glucagon-like peptides 1 and 2 (~30 AA) and oxytocin (9 AA)).<sup>66,67</sup> Given the lack of secondary structure of these peptoids, we sought to probe trends in relative compactness rather than to identify a predominant conformation. Two sequences at the extremes of the sequence space were selected: diblock (dib) and alternating (alt) (Figure 2a). These hydrophobicity patterns have demonstrated different properties, such as temperature-induced phase separation with thermoresponsive peptides in solution,68 assembled peptoid nanosheets, 27, 32, 56, 69 and bulk interfacial width with a mixture of styrene-peptoid conjugates.<sup>38</sup> Two randomized sequences (r1 and r2) were additionally selected to provide an intermediate number of hydrophobic blocks, considering the established role of hydrophobic patterning in macromolecular conformation.33,70

Macromolecules were synthesized using a combination of the submonomer method of peptoid synthesis<sup>71</sup> with a bromoacetic acid acylation followed by substitution with n-butylamine and traditional Fmoc-peptide synthesis to couple a protected glycine monomer (Figure 2b). The modular submonomer method also enabled synthesis of peptoids with site specific probes (i.e., residues with radical probes to facilitate characterization with DEER spectroscopy).

### **2.2 Atomistic Simulations**

Molecular dynamics (MD) simulations uniquely reveal atomiclevel descriptions of the conformational distributions. Due to the significant populations of both cis and trans conformations in the backbone amide bonds of peptoids, coupled with the presence of a high energy barrier for cis/trans exchange, we expected the presence of prominent local minima.<sup>72</sup> Therefore, we opted for temperature replica exchange molecular dynamics (REMD), which allows for overcoming these local energy minima by exchanging replicas of the system at multiple



**Figure 3.** Simulation measurements. a) Schematic of measurements extracted from simulations (top left). Normalized probability distributions of radius of gyration (backbone only), end-to-end distance, maximum distance (backbone only), intramolecular hydrogen bonds, and hydrogen bonds with water for 50,000 conformations of each compositionally identical sequence. b) Representative snapshots of the highest abundance conformations from clustering each of the model sequences (1.4 Å cut-off). c) Probability densities depicting the radius of gyration (backbone only) versus end-to-end distance highlighting the range of individual conformations for each of the four sequences.

temperatures.<sup>73,74</sup> The force field used was an adaptation from GROMOS 53A6 that considers the conformations for peptoids.<sup>75</sup> Simulations of each peptoid as a single chain in bulk water (50,000 conformations of each peptoid) revealed distributions of radii of gyration, end-to-end distances, and numbers of hydrogen bonds (Figure 3a). Analysis of one peptoid molecule enabled single chain conformational analysis without the possibility of multichain assemblies or aggregation, and subtle difference in degree of compactness were revealed. In addition to the four peptoid sequences, we simulated a homoglycine 20mer (gly<sub>20</sub>) as a control sequence lacking hydrophobic side-chains (Figure S1), each in aqueous buffer (100 mM). The smallest average radius of gyration of the peptoid backbone [excluding side-chain contributions; R<sub>g(bkb)</sub>] was observed for alt (0.62 nm) followed by r1 (0.63 nm). While the conformational distributions for these oligomers have overlap, the differences in the distributions are statically significant by two-tailed independent t-test to  $\alpha$  < 0.0001. Larger  $R_{g(bkb)}$  values were calculated for  $\textbf{dib},\,\textbf{r2},\,\text{and}\,\,\textbf{gly}_{\textbf{20}},\,\text{all}$ with an average of 0.65 nm (Figures 3a and S2, Table S1). Radii of gyration of the molecules including side-chain contributions showed fewer differences between the model sequences,

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which we hypothesize is due to the contribution of freely rotating butyl chains to the allocation of mass in the oligomer. The  $R_g$  probability distribution for  $gly_{20}$  was wider than any of the four peptoids that contain hydrophobic residues (Figure S2), due to its random-coil conformation. Further, the average  $R_g$  appears similar to alt, which we hypothesize is due to the lack of steric hinderance from side-chains. For end-to-end measurements under 2 nm, bimodal distributions have previously been correlated with folded and unfolded conformations of disordered oligomers.<sup>76</sup> Similarly, we observe bimodal distributions for the most compact of these sequences, **alt** and **r1**.

To complement measures of radius, the 50,000 conformations were clustered by conformational similarity (within a backbone RMSD of 1.4 Å).<sup>77</sup> This analysis revealed that **alt** has the fewest accessible conformations with 6954 clusters and r1 had 8275 (Table S2-3), while conformations for r2 were grouped into 10813 clusters of similar conformations and dib into 14385. This comparison reveals that alt has half the number of clusters as dib, thus the ensemble of conformations of the diblock included significantly more conformational disorder. The highest abundance conformations are illustrated in Figures 3b and S3,4. The differences in the full conformational distributions are statically significant to  $\alpha$  < 0.0001 and most visually apparent when plotting a probability distribution of the radius of gyration of the backbone,  $R_{g(bkb)}\!,$  and the end-to-end distance of the oligomer,  $R_{ee}$ , (Figures 3c and S5), where narrower, more abundant regions are observed for alt, followed by r1, with less clustering apparent in r2 and dib. The hydrophobic region formed by these macromolecules facilitates environments for intramolecular hydrogen bonds, minimizing hydrogen bonds formed with water. Of the four sequences, alt on average had more intramolecular hydrogen bonds (Figure 3a) and fewer hydrogen bonds with water than the other three compositionally identical peptoids (Figure 3a and Table S4). Of note, since the number of hydrogen bonds for a given conformation is an integer, the distributions are coarser that those of measured distances (e.g., R<sub>ee</sub>). From these collective measurements of the simulated peptoids, we conclude that alt is the most compact and globular, followed by r1 and then r2, and **dib** is the most disordered of the four peptoids.

#### 2.3 Experimental characterization of peptoid sequences

While atomistic simulations offer detailed information at atomic-level resolution, complementary experimental techniques were employed to validate the analysis and to identify more rapid characterization strategies. Well-established techniques to characterize differences in molecular size and structure for oligomers (the model peptoids each have a molecular weight of 1719 g/mol) include ion mobility spectrometry (IMS), NMR spectroscopy, and end-to-end distance measurements with double electron-electron resonance (DEER) spectroscopy. We synthesized and experimentally characterized **alt**, **r1**, and **r2**, omitting **dib** due to the propensity of this architecture to aggregate in solution.<sup>34,36</sup>

coupled with IMS. typically reversed-phase liauid chromatography and mass spectrometry (LC-MS) in complex sample analyses, is a powerful tool for resolving small structural differences, as solution state conformations can be retained in the gas state.<sup>78</sup> IMS has differentiated disordered polymer architectures<sup>16</sup> and charge placement in a series of three compositionally identical oligomeric peptoids.<sup>31</sup> Characterization of purified model peptoids (Figure S6-7) with IMS revealed that alt was the most compact with a collisional cross-section (CCS) of 460.4  $\pm$  0.5 Å<sup>2</sup> (Figure 4a, S8), in agreement with simulations. Statistically indistinguishable ( $\alpha <$ 0.05) CCS measurements were observed for r1 and r2, 461.7 ± 0.5 Å<sup>2</sup> and 462.2 ± 0.5 Å<sup>2</sup>, respectively. Interestingly using a gradient of aqueous solvent (ammonium acetate, 5 mM) to organic solvent (1:1 methanol/acetonitrile), we observed that alt eluted earliest on the LC chromatogram (9.60 ± 0.02 min) compared to **r1** and **r2** (9.63 ± 0.02 and 9.70 ± 0.03 min, respectively). While retention time on reversed phase columns is indicative of molecule polarity, branched small molecules have been observed to elute earlier via LC than their linear isomers with a larger surface area, highlighting that isomers can have different retention times.<sup>79</sup> Evaluating both LC and IMS, all measurements are statistically differentiable using an independent two-tailed t-test at  $\alpha$  = 0.05, and **r2** had a longer retention and larger CCS value, data consistent with the conclusion from the simulations that r2 is more disordered than r1 and alt (Figure 4a).



**Figure 4.** Experimental analysis of peptoids. a) Ion mobility spectrometry including a schematic (left) and a plot of reversed phase liquid chromatography retention time and collisional cross-section from ion mobility spectrometry (right). Error bars represent standard deviation of multiple runs (n = 5). b) 1H-NMR characterization of the amide region of 1H-NMR of non-aggregating peptoids r1 and r2 and the diffusion coefficients calculated with DOSY (right). c) End-to-end distance characterization with DEER including a schematic of the introduction of radical probes into the peptoids (left) and the probability distributions of end-to-end distances resulting from DEER spectroscopy measurements.

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Since these disordered peptoid sequences contain a distribution of conformations as opposed to one predominant folded structure, we anticipated that conformational differences would be challenging to observe experimentally and were excited to see the combination of retention time and CCS recapitulated trends observed in the simulations. While both IMS and LC IMS are performed in non-aqueous environments (e.g., gas and organic phase), conformations of aqueous material have been demonstrated to be retained after desolvation for ion mobility using simulations<sup>78,80</sup> and we offer LC as an additional tool to capture these trends. As each of the selected model sequences contain the same composition, we hypothesize that conformational differences are maintained in these different environments.

probe conformational differences in an aqueous То environment, diffusion ordered spectroscopy (DOSY) was employed, as it has been used to analyze mixtures of biomolecules by molecular diffusivity<sup>15</sup> and to characterize structural distinctions of peptides and foldamers.<sup>81,82</sup> Purified model sequences (0.5 mM) were prepared in acetate buffer (50 mM, pH 4.5). While r1 and r2 were amenable to NMR characterization under these solution conditions, we were unable to observe strong signals for alt by <sup>1</sup>H-NMR. This is likely due to extreme line broadening caused by aggregation, which was visually observable at high concentrations (Figure S9). The diffusion coefficients for the remaining two 20mer peptoids did not suggest significant differences in macromolecular size with diffusion constants of 3.3  $\pm$  0.1 and 3.4  $\pm$  0.2  $\times$  10<sup>-10</sup> m<sup>2</sup> s<sup>-1</sup> for **r1** and r2, respectively. (Figures 4b and S10). However, there were differences in the <sup>1</sup>H-NMR spectrum (Figures 4b and S11). These differences can be caused by unique monomer connectivity and conformationally dependent solvent accessibility and throughspace interactions.

Another method for studying aqueous conformation is through the addition of molecular probes for site-specific distance measurements. Radical probes within a protein or polymer have been used to measure distances between two specific residues,17,83,84 identical including for compositionally oligomers,<sup>85,86</sup> peptidomimetic and simulations have demonstrated that aqueous conformations are retained in D<sub>2</sub>O and 30% by volume of cryoprotectant (d8-glycerol).<sup>17</sup> For the first and last residues of each target peptoid, 4-amino-TEMPO, a radical source, was introduced using the submonomer synthetic method (Figure S12-14). The radicals were reintroduced with ammonia as they were quenched by trifluoroacetic acid during the resin cleavage. Peptoids (200  $\mu$ M) were cryo-protected in 30/70 d-glycerol/D<sub>2</sub>O for DEER spectroscopy. The average  $R_{ee}$  distance distributions were not differentiable for the three model peptoids (3.40, 3.34, and 3.34 nm for alt, r1, and r2, respectively; Figures 4c and S15). However, because the expected distance distributions largely reside below the DEER resolvable range (2-8 nm), this result is not unexpected.<sup>17</sup> Of note, the distributions appear bell-shaped due to the established processing protocols, which include a smoothing parameter.<sup>86</sup> Broadly, these data are consistent with the simulation results that the oligomers are compact and confirm that technique sensitive to distances below 2 nm are

necessary for distinguishing nuanced conformational differences in oligomers.

2.4 Immobilized colorimetric assay. While these computational and experimental techniques are information rich, they can be time- and resource-intensive, require access to specialized instrumentation and associated expertise, or may not be able to resolve conformational differences at small size scales (< 3 kDa). We hypothesized that a solvatochromic dye could provide facile self-consistent qualitative assessment а of macromolecular conformation to complement the techniques previously described. Further, the assay could be implemented on the solid-phase resin required for synthesis, eliminating both the potential for multi-chain aggregation and the need for resin cleavage. Immobilized strategies have been used in highthroughput screens of ligands<sup>88,89</sup> and for assays probing single chain structure with atomic force microscopy.90 While solvatochromic dyes have been leveraged to probe the microenvironments formed by macromolecules, 33,46-48 we uniquely employed a solvatochromic dye for immobilized single-chain conformational characterization enabling future high-throughput studies analogous to those performed for the identification of ligands. Reichardt's dye91 was chosen as a conformational probe due to the rapid one-step synthesis<sup>92</sup> (Figure S16) and desirable low limit of water solubility, reducing any background signal. Further, the dye exhibits vibrant colors upon introduction to a hydrophobic environment.93 Fluorophores Nile Red and Sypro orange were additionally selected as common probes of protein hydrophobic regions.41-<sup>44</sup> Only brightfield images were collected of the immobilized sequences, as fluorescent images could be convoluted by quenching and photobleaching of the dyes within the resin.

The four model peptoids were synthesized on a poly(acrylamide) resin crosslinked with poly(ethylene glycol) (PEGA), which is a water-swellable support that demonstrates no interaction with Reichardt's dye when unfunctionalized (Figure 5a). Each bead of resin is 50-100 µm in diameter and contains many spatially separated copies of a single sequence. PEGA resin has shown to be permeable by molecules >35 kDa, indicating a significant pore size.<sup>94,95</sup> To confirm high-purity synthesis on the PEGA resin, a portion of the resin was cleaved and characterized via LC-MS and MALDI-TOF MS (Figure 5a and S17-18).

The peptoid-functionalized resin was incubated with a buffered solution of Reichardt's dye (0.15 mM in 100 mM HEPES, pH 7.8). The color of the resin was visualized with optical microscopy, and Reichardt's dye also offered stronger differentiation than Nile Red or Sypro orange (Figure S19). Incubation with Reichardt's dye revealed trends that correlated with the previously identified conformational trends. Additionally, a proline and alanine-rich peptide, known to be a random coil,<sup>68,96</sup> was transparent after incubation with dye, indicating that extended disordered conformations do not interact with the solvatochromic probe (Figure S20-21). Reichardt's dye is better solubilized by more hydrophobic environments, and thus we hypothesized that darker colors would correspond to more hydrophobic pockets formed by a more compact peptoid.<sup>38,39</sup>

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**Figure 5.** Immobilized colorimetric assay: a) PEGA resin incubated with Reichardt's dye (0.150 mM in 100 HEPES pH = 7.8) imaged on brightfield microscope, and respective MALDI-TOF MS spectra of cleaved material for each of the four peptoid sequences, and b) comparisons across all characterization methods, including average measurements from the atomistic simulations.

The resin color was consistent across beads of different diameters, suggesting the bead size distribution did not affect the colorimetric output (Figure 5a and S22). The darkest color was observed for alt, correlating with the more compact structure consistent with observations from simulations and LC-IMS-MS (Figure 5b). Differences in hue anticipated for the solvatochromic Reichardt's dye were challenging to quantify, but **alt** appeared bluer in hue as comp ared to other sequences. The paler color of **dib** correlates with the most disordered structure, correlating with simulations. The randomized sequences were intermediate in dye saturation with r1 darker than r2, consistent with observations from LC-IMS-MS and simulations that characterize r2 as more disordered than r1. The dye saturation showed slight variations in replicate preparations and under different cameras; however, the color intensity trends remained the same across the peptoid sequences (Figures S23-24). Thus, this immobilized system enables facile analysis of small differences between conformational ensembles in a semi-quantitative colorimetric fashion, without requiring specialized instrumentation or expertise.

# **3** Conclusions

Disordered peptidomimetics provide a fruitful platform for developing functional materials, but their broad conformational ensembles can present challenges for characterization. A combination of complementary characterization techniques therefore becomes essential for studying small, disordered oligomers, as each technique provides unique descriptors regarding the composition of the conformational ensemble. This is especially pertinent for compositionally identical oligomers, exemplified by the four peptoids investigated in this study. Through the integration of atomistic simulations and IMS coupled to LC, our data reveals a diverse range of distinct conformational ensembles accessible to compositionally identical peptoids. Notably, these conformational trends correlate with the colorimetric output of a Reichardt's dye assay, which requires no specialized instrumentation or expertise. By utilizing these techniques in combination, we can thus discern even subtle differences in conformation, as the

complementary conformational descriptors increase confidence in these nuanced results. Interestingly, we observed that the alternating conformation was the most compact. This finding underscores a key point: while randomized sequences can access more compact conformations than regular patterns, such as Segalman et al's computationally optimized "proteinlike" peptoid sequence, our results demonstrate the necessity of specific hydrophobic patterns for achieving this compactness.

Exploring additional sequences with the suite of techniques described herein will yield valuable structural insights and facilitate connections between sequence, structure, and function. The colorimetric assay and LC-IMS-MS analysis will benefit from ongoing comparisons to simulations, NMR spectroscopy, and end-to-end distance measurements to elucidate molecular mechanisms. The resolution of DEER and DOSY spectroscopies can be enhanced in future efforts by increasing the radical concentration and incorporating isotopic probes, respectively.

Further expansion of the colorimetric assay will offer additional inexpensive and accessible methods for studying conformational differences in peptidomimetics and foldamers. The use of motif specific dyes (e.g., Thioflavin T for  $\beta$ -sheets<sup>97</sup>) would expand the applicability and specificity of this system beyond disordered collapse. Additionally, this assay can be completed in high throughput followed by corroboration with specialized lower-throughput techniques. This allows for the rapid analysis of the impact of varying environmental conditions on conformational distributions (e.g., solvent or salt variations) in addition to combination with existing immobilized assays.

We hypothesize that the subtle differences measured by these tools may impact binding efficacy, cell permeability, and halflife of macromolecular therapeutics. Continued elucidation of conformational descriptors will inform the design of macromolecules with desired properties that can be equipped with functional handles, paving the way for tailored functional materials, catalysts, ligands, and therapeutics.

## **Author contributions**

Conceptualization, E.C.D. and A.S.K. Methodology, E.C.D. and A.S.K. Investigation and Formal Analysis, E.C.D., K.C.C., J.Z, A.J.D., J.N.D, M.A.Y., J.R.B., and R.B.B. Resources, E.S.B, R.B.B, J.E.S, and A.S.K. Writing – Original Draft, E.C.D. and A.S.K. Writing – Review & Editing, E.C.D., K.C.C., A.J.D., J.N.D, M.A.Y., S.H., E.S.B., R.B.B., J.E.S., and A.S.K. Funding Acquisition and Supervision A.S.K.

# **Conflicts of interest**

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The authors declare no conflict of interest.

# Data availability

The data supporting this article have been included as part of the Supplementary Information.

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