

# Helix Nucleation Kinetics From Molecular Simulations in Explicit Solvent

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**ABSTRACT** We study the reversible folding/unfolding of short Ala and Gly-based peptides by molecular dynamics simulations of all-atom models in explicit water solvent. A kinetic analysis shows that the formation of a first  $\alpha$ -helical turn occurs within 0.1–1 ns, in agreement with the analyses of laser temperature jump experiments. The unfolding times exhibit Arrhenius temperature dependence. For a rapidly nucleating all-Ala peptide, the helix nucleation time depends only weakly on temperature. For a peptide with enthalpically competing turn-like structures, helix nucleation exhibits an Arrhenius temperature dependence, corresponding to the unfolding of enthalpic traps in the coil ensemble. An analysis of structures in a “transition-state ensemble” shows that helix-to-coil transitions occur predominantly through breaking of hydrogen bonds at the helix ends, particularly at the C-terminus. The temperature dependence of the transition-state ensemble and the corresponding folding/unfolding pathways illustrate that folding mechanisms can change with temperature, possibly complicating the interpretation of high-temperature unfolding simulations. The timescale of helix formation is an essential factor in molecular models of protein folding. The rapid helix nucleation observed here suggests that transient helices form early in the folding event. *Proteins* 2001;42:77–84.

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## INTRODUCTION

The kinetics of protein folding is increasingly seen as a key to elucidating the mechanisms that guide the self-assembly of proteins into their folded structure.<sup>1–26</sup> This growing interest in protein folding kinetics continues to stimulate the development of fast, time-resolved spectroscopic methods to probe the earliest, submicrosecond events in protein folding.<sup>14,21,27,28</sup> At the same time, molecular simulations of proteins in water—although still too expensive computationally for routine studies of millisecond (or even microsecond) folding events—are increasingly overlapping with the timescales of those fastest experiments, as shown by folding simulations extending beyond a microsecond<sup>29,30</sup> and extensive studies of the equilibrium folding kinetics of a  $\beta$ -peptide,<sup>31,32</sup> or by the mapping of protein free energy surfaces.<sup>26,33</sup>

These exciting developments both on the experimental and on the computational side have reinvigorated an analysis of fundamental steps in protein folding, in particular the formation of secondary structure, such as  $\alpha$ -helices and  $\beta$ -turns.<sup>17,34–45</sup> One of the key results of the experimental studies is that  $\alpha$ -helix formation, a fundamental element of protein folding, was shown to occur over a nanosecond timescale.<sup>46,47</sup> However, this fast rate of helix formation was recently questioned on the basis of stopped-flow circular dichroism (CD) experiments that indicate a timescale of 0.1 s for helix formation,<sup>48</sup> about six orders of magnitude slower than the earlier laser temperature jump experiments.<sup>46,47</sup> These recent results question not only the laser  $T$  jump studies but also mechanisms of protein folding that require early formation of native-like secondary structure, because mostly helical proteins, such as a  $\lambda$  repressor fragment, were shown to fold in as fast as 20  $\mu$ s,<sup>16</sup> four orders of magnitude faster than the timescale of helix formation found by CD.<sup>48</sup>

In helix-coil theory,<sup>49–52</sup> forming the first helical turn stabilized by  $(i, i + 4)$  backbone hydrogen bonds nucleates a helix, followed by helix propagation. Here, we use molecular simulations to study this initial phase of helix formation. From the equilibrium dynamics of blocked penta-peptides in explicit water, we determine the timescales of forming and breaking the first helical turn. The simulations cover a broad range in temperature and time and explore variations in the peptide sequence.

## MATERIALS AND METHODS

We perform molecular dynamics (MD) simulations to study reversible helix nucleation of the simplest peptide sequences that can form 1.5 turns of  $\alpha$ -helix with three  $(i, i + 4)$  backbone hydrogen bonds: Ac-Ala<sub>5</sub>-NHMe ( $A_5$ ), Ac-Ala<sub>2</sub>-Gly-Ala<sub>2</sub>-NHMe ( $A_2GA_2$ ), and Ac-Gly<sub>5</sub>-NHMe ( $G_5$ ). These peptides are simulated in explicit solvent at temperatures from 250 K to 400 K for about 10 ns per run. The MD simulations of the peptides  $A_5$ ,  $A_2GA_2$ , and  $G_5$  are performed by using the AMBER 4.1 program<sup>53</sup> and the all-atom AMBER 94 force field.<sup>54</sup> The 1–4 interactions are

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Received 1 May 2000; Accepted 29 August 2000

**TABLE I. Length of MD Production Runs in Nanoseconds**

$T$ [K]	$A_5$	$A_2GA_2$	$G_5$
250	11.6	—	—
275	12.8	—	—
300	12.0	13.4	10.0
350	13.4	12.5	—
400	7.8	4.8	—

consistently scaled by a factor of 1/1.2. The peptides are immersed into an aqueous solvent containing 500 ( $A_2GA_2$ ), 499 ( $A_5$ ), and 461 ( $G_5$ ) TIP3P water molecules,<sup>55</sup> respectively. All simulations are performed under periodic boundary conditions. Long-range electrostatic interactions are treated by using the particle-mesh-Ewald (PME) method.<sup>56</sup> A grid of  $32 \times 32 \times 32$  points is used in the PME calculations, resulting in a grid width of about 0.8 Å. A third-order spline interpolation is used with a real-space tolerance factor  $DSUM\_TOL = 1.1 \times 10^{-6}$ . A time step of 2 fs is used in the MD simulations, constraining the length of bonds involving hydrogen atoms by using the SHAKE algorithm.<sup>57</sup> The size of the cubic box is equilibrated at constant pressure (1 bar) and temperature by using the Berendsen coupling algorithm.<sup>58</sup> The production runs are performed at constant volume and temperature, with configurations saved for analysis every 1 ps. The length of the production runs is compiled in Table I.

The peptide sequences used in the simulations are  $CO(CH_3)-Ala_5-NH(CH_3)$ ,  $CO(CH_3)-Ala_2-Gly-Ala_2-NH(CH_3)$ , and  $CO(CH_3)-Gly_5-NH(CH_3)$ , with acetyl and N-methyl blocking groups neutralizing the ends. This results in 30, 29, and 25 heavy atoms (C, N, O) and 32, 30, and 22 hydrogen atoms for  $A_5$ ,  $A_2GA_2$ , and  $G_5$ , respectively. Fully extended peptides are energy minimized in vacuo and then solvated. Water molecules that overlapped with atoms of the peptide are removed. The solvated systems are equilibrated for at least 100 ps at 300 K. The simulations at temperatures different from 300 K are started from structures taken from the 300-K run, which are then equilibrated at constant pressure for at least 100 ps.

## RESULTS

### Principal-Component Analysis of Peptide Conformation Space

To quantify the kinetics of helix nucleation, we first identify a helical reference structure based on a principal-component axes (PCA) projection<sup>59,60</sup> of the peptide conformation spaces (Fig. 1) applied recursively. This recursive use of PCA analysis is suggested by the observation of a hierarchical structure in the energy landscape of proteins.<sup>61</sup> The structures within  $2k_B T$  of the minimum in the free energy surface of the first *three* PCA components of  $A_5$  at 300 K are subjected to a second round of PCA analysis. Four additional rounds of PCA analysis are conducted by using the structures within  $1k_B T$  of the previously found minimum (i.e., we include regions  $x_{PCA}$  of PCA conformation space with a PCA conformation-space density of  $\rho(x_{PCA})/\max[\rho(x_{PCA})] > e^{-1}$  in successive rounds of PCA analysis). The structures remaining after this recursive

PCA analysis are highly homogeneous, and their average is a helical structure shown in Figure 2. The backbone dihedral angles ( $\phi, \psi$ ) for  $Ala_1$  to  $Ala_5$  of this reference structure are  $(-57.4, -45.3)$ ,  $(-64.0, -40.9)$ ,  $(-63.9, -41.9)$ ,  $(-63.4, -37.8)$ , and  $(-70.9, -23.8)$  in units of degrees.

The multidimensional free energy surfaces projected onto the first two PCAs show strikingly different characteristics for the three peptides (Fig. 1).  $G_5$  shows an essentially featureless free energy surface in the PCA plane. This is indicative of the absence of a dominant structure class for the  $G_5$  peptide. In particular, no appreciable fraction of helical structures is found for  $G_5$ . The free energy surface of  $A_5$ , on the other hand, is dominated by a deep minimum that corresponds to  $\alpha$ -helical structures. The minimum is at the bottom of a funnel-like free energy surface. The  $A_2GA_2$  peptide has the most structured free energy surface with a primary helical minimum. Additional minima are located within the coil region of the free energy surface. In particular, a substantial population of turn-like structures<sup>62,63</sup> (Fig. 3) results from the flexibility of the central Gly residue.

### Helix Nucleation Kinetics

Figure 4 shows the root-mean-square distance (RMSD) from the helical reference structure for  $A_5$  as a function of time for temperatures between 250 K and 400 K. RMSDs were calculated for the heavy atoms of the backbone, excluding hydrogen and  $C_\beta$  atoms. The features of the RMSD time series suggest a multitude of two-state like (helix-coil) transformations from low RMSD to high RMSD and vice versa. Relaxation occurs on the subnanosecond timescale, except at 300 K where a fully extended peptide conformation ( $RMSD > 3$  Å) occurred only once and did not relax for about 1 ns. Fully extended structures of  $A_5$  did not occur at lower temperatures (250 K, 275 K) and relaxed rapidly at higher temperatures (350 K, 400 K). Figure 5 shows the distributions of RMSDs from the helical reference structure at 300 K for peptides  $A_5$ ,  $A_2GA_2$ , and  $G_5$ . The distributions are sharply peaked at small RMSDs for the  $A_5$  and  $A_2GA_2$  peptides. We thus define the helical ensemble as the conformations within 0.6 Å RMSD from the helical reference structure, corresponding to the first peak in the RMSD distributions of  $A_5$  and  $A_2GA_2$  (Fig. 2). The kinetics of helix nucleation is then determined from the interconversion between helical ( $RMSD < 0.6$  Å) and coil states ( $RMSD \geq 0.6$  Å).

Figure 6 shows the mean first passage times (MFPT) for helix nucleation and helix-to-coil transitions. MFPTs are defined as the average time to reach the dividing surface ( $RMSD = 0.6$  Å) between coil and helix states from an equilibrium distribution in the coil and helix ensembles, respectively. The most striking result is that helix nucleation occurs rapidly on a timescale of 0.1 ns for  $A_5$ , and 0.1–1 ns for  $A_2GA_2$ . This is consistent with helix formation times of near 100 ns for peptides of about 20 amino acids, as determined from laser  $T$  jump measurements with infrared and fluorescence probes,<sup>46,47</sup> and in contrast to CD data suggesting a helix formation time of about 0.1 s

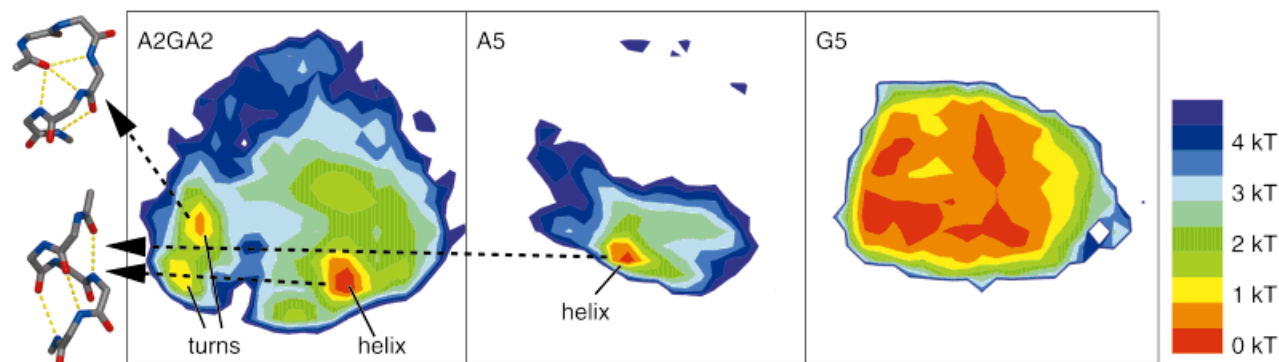


Fig. 1. Free energy profiles in the plane of the first (horizontal axis) and second PCA (vertical axis) of the peptides  $A_2GA_2$  (left),  $A_5$  (middle), and  $G_5$  (right) at 300 K. The color coding indicates free energy differences to the respective minimum in units of  $k_B T$ . Shown on the left are the backbones of the helical reference structure (bottom) and of a turn structure (top), corresponding to minima in the free energy surfaces.

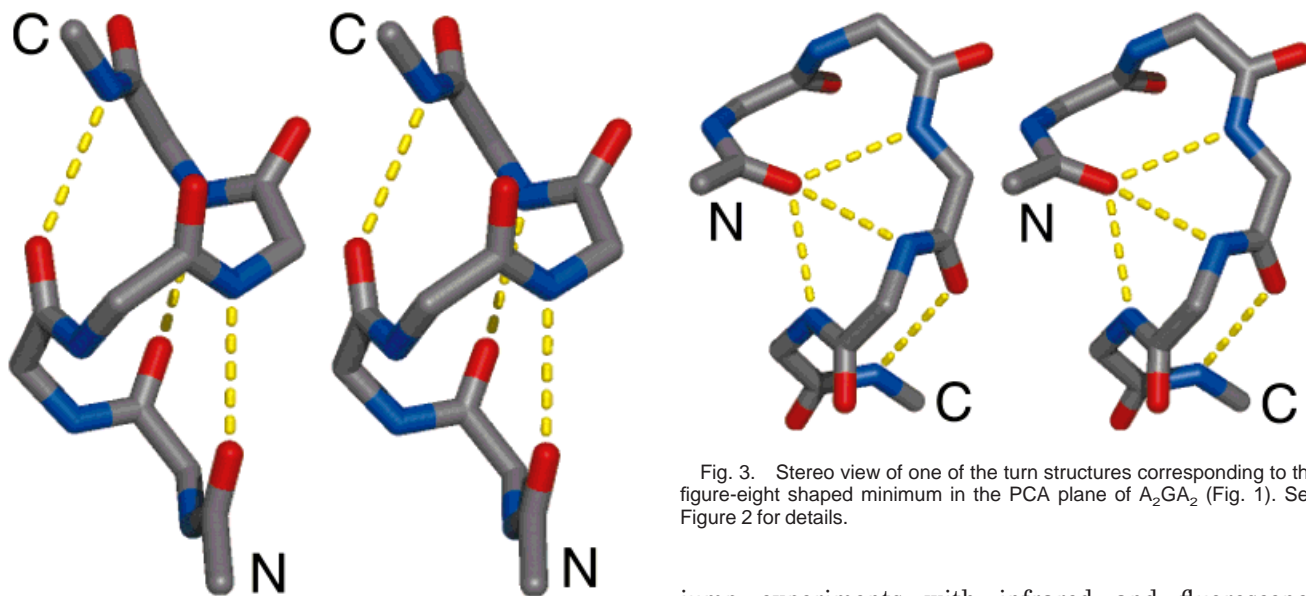


Fig. 2. Stereo view of the helical reference structure of peptide  $A_5$ . Shown are the heavy backbone atoms with carbon atoms in gray, oxygen atoms in red, and nitrogen atoms in blue. Dotted yellow lines indicate backbone hydrogen bonds. N and C indicate the N and C-terminus of the peptide.

for a 16 amino acid peptide.<sup>48</sup> Quantitative support for subnanosecond helix nucleation times comes from a detailed kinetic analysis of helix-coil transition experiments: Thompson et al.<sup>64</sup> estimate the relaxation time for nucleating a first helical turn in a 21-residue Ala peptide to be  $< 0.1$  ns, starting from an all-coil state. Tobias and Brooks<sup>65</sup> estimated helix initiation times for Ac-Ala<sub>3</sub>-NMe of about 100 ps from a kinetic interpretation of calculated free energy differences between extended, turn, and helical structures. Subnanosecond timescales have also been observed for turn formation of penta and hexapeptides.<sup>41,43</sup> A kinetic interpretation of the Zimm-Bragg model for the helix coil transition, with barriers derived from free energy simulations, led to estimated helix formation times in the 10–100 ns range,<sup>66</sup> as measured in  $T$

jump experiments with infrared and fluorescence probes.<sup>46,47</sup>

Helix nucleation is significantly faster for  $A_5$  than for  $A_2GA_2$ . Furthermore, the MFPTs for helix nucleation of  $A_5$  are practically temperature independent over the range studied here ( $250 \text{ K} < T < 400 \text{ K}$ ), whereas those of  $A_2GA_2$  exhibit Arrhenius behavior. Temperature-independent helix formation rates were indeed deduced from a two-state analysis of the experimental<sup>64</sup> helix relaxation kinetics (J. Hofrichter, personal communication). Figure 6 shows that helix-to-coil transitions are only slightly faster for  $A_2GA_2$  than for  $A_5$ . Both  $A_5$  and  $A_2GA_2$  exhibit Arrhenius-like behavior for helix-to-coil transitions,  $\text{MFPT} \sim \exp(\Delta H^\ddagger/k_B T)$ , with similar enthalpic barriers of  $\Delta H^\ddagger = 13.9 \pm 1$  and  $10.9 \pm 2 \text{ kJ mol}^{-1}$ , respectively (neglecting the temperature dependence of the solvent viscosity). These results strongly suggest a thermally activated process for the helix-to-coil transitions of both  $A_5$  and  $A_2GA_2$ . Helix nucleation of  $A_5$ , on the other hand, is dominated by a diffusive search in the coil state, with transitions into the helical state over a small free energy barrier ( $k_B T$  or less).<sup>67</sup>

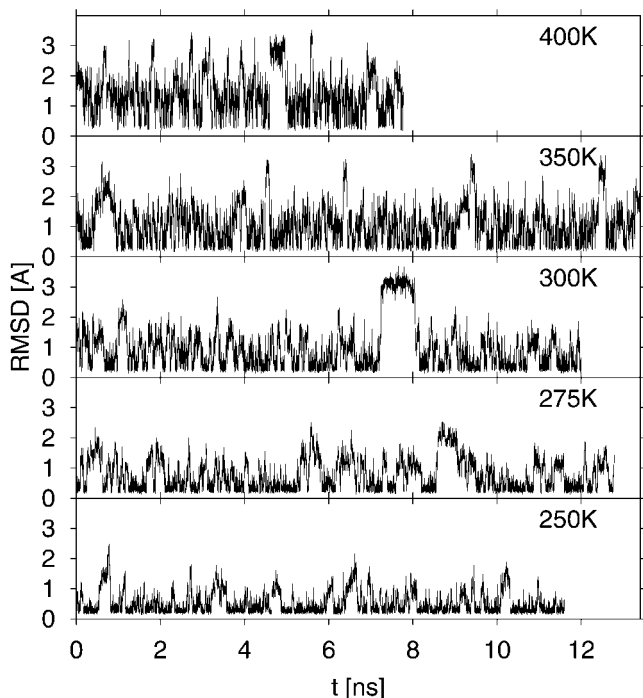


Fig. 4. RMSD of  $A_5$  from the helical reference structure as a function of time for temperatures between 250 and 400 K.

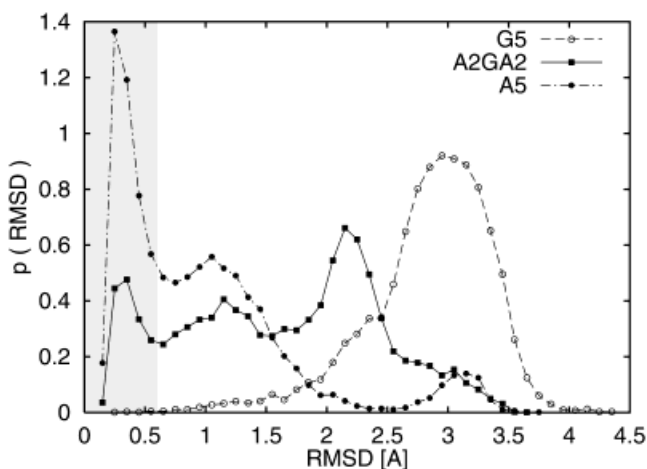


Fig. 5. Probability distribution of the RMSD from the helical reference structure at 300 K. The shaded region of RMSD below 0.6 Å defines the helical state.

For  $A_2GA_2$ , unlike  $A_5$ , the MFPTs for helix nucleation depend on temperature. The PCA analysis of the  $A_2GA_2$  conformation space (Fig. 1) suggests that this temperature dependence of the helix nucleation MFPTs arises from “unfolding” of enthalpically stabilized “trap” conformations rather than crossing of an activation barrier close to the helical state. We investigate this by studying the “unfolding” rates from the figure-eight shaped minimum in the  $A_2GA_2$  PCA plane shown in Figure 1. A conformation of  $A_2GA_2$  is considered to belong to that state when it has  $< 0.5$  Å RMSD from one of the two turn-like reference

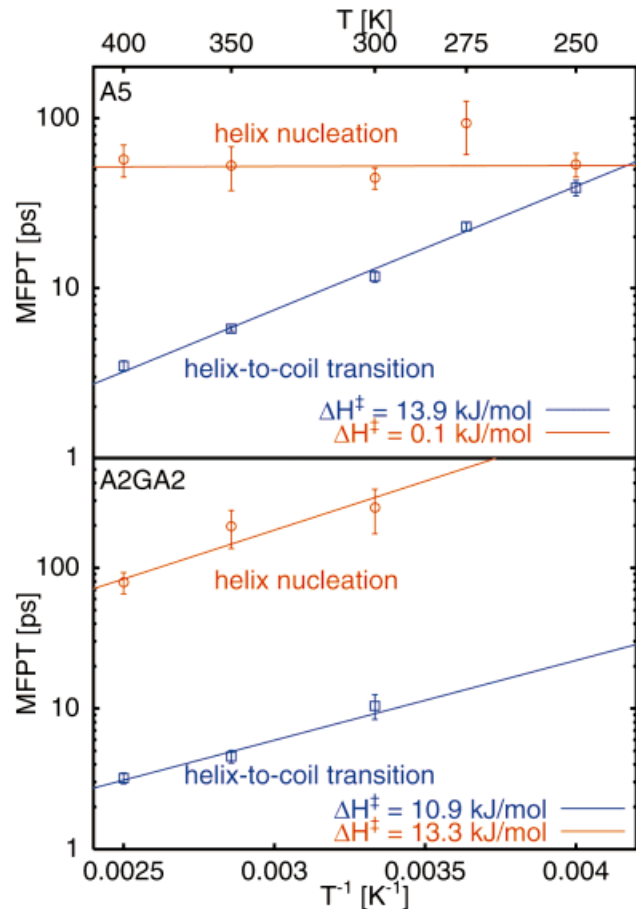


Fig. 6. Temperature dependence of MFPTs for helix nucleation (red) and helix-to-coil transitions (blue) of  $A_5$  (top) and  $A_2GA_2$  (bottom). Helix nucleation and helix-to-coil transition times are shown as circles and squares, respectively. The lines are fits to Arrhenius models,  $\text{MFPT} \sim \exp(\Delta H^\ddagger/k_B T)$ .

structures defined by PCA analysis of the figure-eight shaped minimum. With this definition, we find that the MFPT for escape from this “folding trap” has an Arrhenius temperature dependence with an activation enthalpy of about  $10.4 \pm 1$  kJ mol $^{-1}$ . This activation enthalpy for escape from a “trap” conformation agrees well with the apparent activation enthalpy of  $13.3 \pm 4$  kJ mol $^{-1}$  for helix nucleation of  $A_2GA_2$ , as shown in Figure 6. With identical helix-to-coil transition times of  $A_5$  and  $A_2GA_2$  (Fig. 6), we conclude that the effect of changing the central Ala residue to Gly affects only the coil side of the equilibrium through introduction of “folding traps,” but not the helical side. The role of enthalpic traps in determining the folding times of heteropeptides is discussed below.

### Transition-State Ensemble

We now attempt to characterize the “pathways” of helix formation and unfolding. We define a “transition-state ensemble” as those coil conformations (i.e., with RMSD from the helical reference structure  $> 0.6$  Å) that were helical either at the 1-ps snapshot before or after, by using the  $A_5$  trajectory at 350 K. With that definition, we capture



**TABLE II. Backbone Hydrogen-Bond Distances (in Å Units) Between Carbonyl Oxygen and Amide Nitrogen Atoms of the Structures Participating in the Transition-State Ensemble (Columns 2-5)<sup>†</sup>**

	O <sub>1</sub> N <sub>5</sub>	O <sub>2</sub> N <sub>6</sub>	O <sub>3</sub> N <sub>7</sub>	O <sub>3</sub> N <sub>6</sub>	250 K	275 K	300 K	350 K	400 K
1	3.1	3.5	<u>5.2</u>	<u>4.0</u>	0.65	0.57	0.50	0.40	0.31
2	<u>4.6</u>	3.2	3.3	3.5	0.20	0.23	0.25	0.25	0.24
3	3.0	<u>5.0</u>	3.2	3.2	0.08	0.09	0.11	0.12	0.10
4	3.1	3.1	3.2	<u>4.0</u>	0.02	0.03	0.04	0.09	0.15
h	3.0	3.1	3.2	3.5	0.01	0.02	0.02	0.02	0.02
o					0.03	0.05	0.08	0.13	0.19

<sup>†</sup>Also listed is the fraction at which these structures participate in the transition-state ensemble for temperatures between 250 and 400 K (columns 6–10). The first column lists the four structure classes identified through recursive PCA analysis. Also included are the helical (h) and other (o) structure classes. Residues 1 and 7 are the acetyl and N-methyl blocking groups, respectively. Underlined numbers are highlighting broken hydrogen bonds with O-N distances exceeding 3.5 Å, respectively.

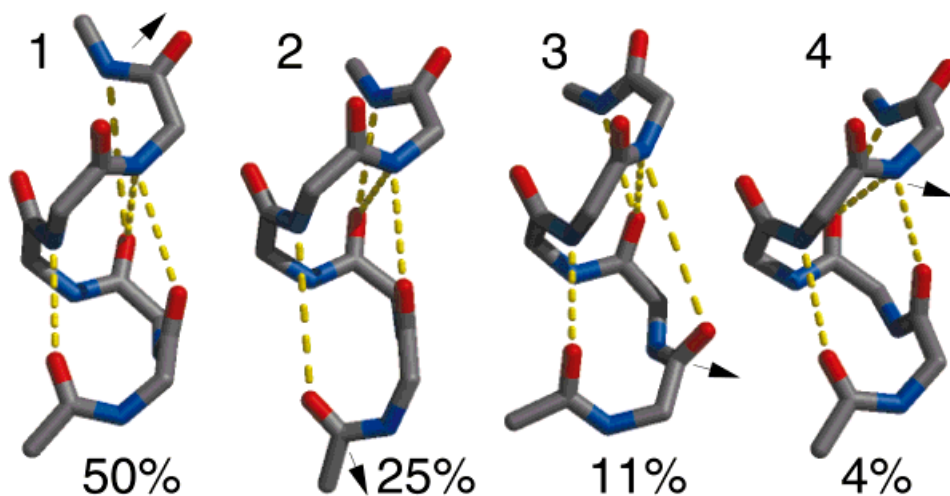


Fig. 7. Reference structures of the transition-state ensemble for helix formation and unfolding. The four structures are numbered as in Table II. Arrows indicate the dominant motion relative to the helical reference structure shown in Figure 2. The percentage numbers at the bottom indicate the relative participation in the A<sub>5</sub> transition-state ensemble at 300 K. See Figure 2 for details.

those coil peptide conformations that convert most rapidly into or from a helical state. The structures within 1 ps of the helical state are analyzed by using PCA.<sup>59,60</sup> In a PCA representation using the first three PCA components, we identify four distinct conformations as part of this transition-state ensemble. A recursive PCA analysis defines reference structures for each of the four conformational basins. These structures have distinct backbone hydrogen-bonding features, as summarized in Table II and shown in Figure 7.

For every conformation of the transition-state ensemble we have calculated the RMSD from the four reference structures and the helical structure. A reference structure is then assigned on the basis of the smallest RMSD. If the minimum RMSD exceeded 0.7 Å, we did not assign a structure. With that definition, we can partition the transition-state ensemble at 300 K to about 92%. The dominant structure in the transition-state ensemble has the C-terminal ( $i, i + 4$ ) hydrogen bond broken (50%). The second-most prevalent structure (25%) has the N-terminal ( $i, i + 4$ ) hydrogen bond broken. About 12% of the

structures in the transition-state ensemble have the central ( $i, i + 4$ ) hydrogen bond broken. Approximately 9% of the structures lost the weak, bifurcated C-terminal ( $i, i + 3$ ) hydrogen bond. A recent NMR study<sup>68</sup> indicated a significant population of ( $i, i + 3$ ) hydrogen bonds at helix termini of alanine-based peptides and corresponding 3<sub>10</sub> helices, which have been implicated as intermediates in the helix-coil transition.<sup>69</sup> ( $i, i + 3$ ) hydrogen bonds as intermediates in helix formation and breakage were also incorporated into kinetic models of helix formation.<sup>65,70</sup>

The composition of the transition-state ensemble suggests that helix formation and unfolding occur predominantly through addition or breaking of a single hydrogen bond. The C-terminal hydrogen bond appears to be the most fragile, resulting either in breaking (structure 1 in Table II and Fig. 7) or loss of its weakly bifurcated character (structure 4 in Table II and Fig. 7). The central hydrogen bond is the most protected. Preferential unfolding of  $\alpha$ -helices from the C-terminal end was observed in earlier MD simulations.<sup>38,39,40</sup> Based on free energy calculations, this effect could be attributed to solvent interac-

tions favoring C-terminal unfolding.<sup>71</sup> The temperature-dependent composition of the transition-state ensemble listed in Table II indicates that breaking of the C-terminal ( $i, i + 4$ ) hydrogen bond dominates particularly at low temperatures, whereas at higher temperature loss of its bifurcated character gains in importance, as does breaking of the N-terminal ( $i, i + 4$ ) hydrogen bond. This suggests an entropic contribution to the relative weighting of folding/unfolding pathways.

## CONCLUSIONS

From molecular simulations of blocked penta-peptides in water, we conclude that the initial step in helix nucleation is fast, on the order of 0.1–1 ns, depending on sequence and temperature. Although this is anticipated from fast, time-resolved experiments using infrared and fluorescence probes of helix-coil transitions,<sup>46,47,64</sup> it appears to contradict recent CD studies<sup>48</sup> that found helix formation rates of about  $15 \text{ s}^{-1}$ . Our results suggest a significant influence of the amino acid sequence on the helix nucleation kinetics through the introduction of enthalpically stabilized conformations into the coil state. In addition, transient hydrophobic interactions between the aliphatic parts of lysine side chains in the coil state of the AK peptide<sup>48</sup> could result in slower helix formation. Increased hydrophobic effects with increasing temperature<sup>72,73</sup> (0–60°C) would partly explain the observed reduction in relaxation rates with increasing temperature.<sup>48</sup> However, a difference of six orders of magnitude in experimental helix formation times<sup>46–48</sup> ( $10^{-7}$  vs.  $10^{-1}$  s) cannot easily be accounted for by variations in peptide length and sequence. Thus, further experiments are required to resolve this discrepancy.

An analysis of the sequence dependence of helix nucleation reveals surprising similarities to protein folding models. Within the energy-landscape description of protein folding, the all-Ala peptide can be classified as a “fast-folding” peptide, where the helix nucleation kinetics is determined by downhill diffusion in conformation space without a significant free energy barrier to the helical state.<sup>3,74</sup> Substituting the central Ala by Gly introduces enthalpically stabilized “traps” into the coil state. Helix nucleation in A<sub>2</sub>GA<sub>2</sub> thus requires a combination of activated escape from these enthalpically trapped conformations and subsequent conformational diffusion. Similar effects may be expected for heteropolymers where hydrophobic contacts not leading to the helical state can increase the helix formation time. This highlights the role of non-native interactions in the unfolded state of proteins.<sup>75,76</sup>

Although a Gly substitution at the center of the peptide slows down the helix nucleation kinetics, the helix-to-coil transition is unaffected. We find that helix breaking requires a thermally activated escape from an enthalpically stabilized helical state. The height of the enthalpic barrier is similar in the A<sub>5</sub> and A<sub>2</sub>GA<sub>2</sub> peptides, suggesting that it derives from breaking the backbone hydrogen bonds and not hydrophobic interactions or dihedral angle barriers. This is further supported by an analysis of the

transition-state ensemble. In agreement with earlier studies,<sup>38–40,71</sup> we find that unfolding occurs predominantly through breaking of single hydrogen bonds at the helix ends, with the C-terminal hydrogen bond being the most fragile.

The weighting of specific unfolding pathways exhibits a considerable temperature dependence, reflecting entropic components in the corresponding transition-state free energies. This finding highlights possible difficulties in extrapolating results of high-temperature unfolding simulations to room temperature. Because the transition state ensemble itself depends on temperature, temperature changes affect not only the timescales but also relative weights of different folding/unfolding pathways.

We emphasize that equilibrium simulations, such as those reported here, bring experimental and theoretical studies of biomolecular dynamics and folding to closer overlap. Although direct comparisons between time-resolved experiments and simulations are affected by the definition of states (helical and coil), future simulation studies might aim directly at reproducing measured quantities, such as time-dependent infrared absorbance, fluorescence, or ellipticity. This will offer unique opportunities: on one hand, we can use the experimental constraints to fine-tune potential parameterizations; on the other hand, the atomic resolution of molecular simulations will help interpret and guide experiments.

## ACKNOWLEDGMENTS

We thank William A. Eaton, Attila Szabo, R. Brian Dyer, J. Hofrichter, and José N. Onuchic for many stimulating discussions. Computer access to the Los Alamos ASCI Nirvana supercomputer through an IHPCI grant is gratefully acknowledged.

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