# Even with nonnative interactions, the updated folding transition states of the homologs Proteins G & L are extensive and similar

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Experimental and computational folding studies of Proteins L & G and NuG2 typically find that sequence differences determine which of the two hairpins is formed in the transition state ensemble (TSE). However, our recent work on Protein L finds that its TSE contains both hairpins, compelling a reassessment of the influence of sequence on the folding behavior of the other two homologs. We characterize the TSEs for Protein G and NuG2b, a triple mutant of NuG2, using  $\psi$  analysis, a method for identifying contacts in the TSE. All three homologs are found to share a common and near-native TSE topology with interactions between all four strands. However, the helical content varies in the TSE, being largely absent in Proteins G & L but partially present in NuG2b. The variability likely arises from competing propensities for the formation of nonnative  $\beta$  turns in the naturally occurring proteins, as observed in our TerltFix folding algorithm. All-atom folding simulations of NuG2b recapitulate the observed TSEs with four strands for 5 of 27 transition paths [Lindorff-Larsen K, Piana S, Dror RO, Shaw DE (2011) Science 334 (6055):517-520]. Our data support the view that homologous proteins have similar folding mechanisms, even when nonnative interactions are present in the transition state. These findings emphasize the ongoing challenge of accurately characterizing and predicting TSEs, even for relatively simple proteins.

protein folding  $| \psi$  analysis  $| \phi$  analysis | bi-histidine | transition state ensemble

A lthough different sequences can adopt similar structures, leach one encodes for a unique free energy surface that may lead to distinct folding behavior. This issue has been investigated by probing how folding transition state ensembles (TSEs) differ for homologous proteins (1, 2). Both experimental and computational studies of the  $\alpha/\beta$  homologs Proteins L & G typically identify their TSEs as being polarized, consisting of either the N- or C-terminal hairpin, respectively (3–16). Moreover, NuG2, a variant of Protein G designed to have a more stable N-terminal  $\beta 1 + \beta 2$  hairpin, is thought to fold through a TSE featuring this hairpin rather than the C-terminal  $\beta 3 + \beta 4$  hairpin found in its parent's TSE (15).

However, we recently demonstrated that Protein L's TSE contains both hairpins in a four-stranded  $\beta$  sheet, whereas the native helix remains weakly formed, if at all (17). The difference between this and prior studies emerges from our use of  $\psi$  analysis with engineered bi-histidine (biHis) metal ion binding sites to directly identify the residue-residue contacts in the TSE (18–20), whereas the earlier investigations used mutational  $\phi$  analysis (10–16). The revised picture of Protein L's TSE provides the present motivation for a corresponding analysis on Protein G and NuG2 to properly investigate their sequence–folding relationship.

Accordingly, we apply  $\psi$  analysis to Protein G and NuG2b, a fast folding, triple mutant of NuG2 studied by Shaw and coworkers in all-atom molecular dynamics (MD) simulations (21). These two proteins have 73% sequence identity, whereas Proteins G & L share only 13% identity (22). In common with Protein L, their TSEs are deduced to contain four  $\beta$  strands, in contrast to the polarized TSEs previously identified (15). This significant discrepancy is due in part to the presence of nonnative hairpin structures in the TSEs of the two naturally occurring proteins (15, 16). These nonnative turns are likewise found in silico using our *TerltFix* folding algorithm (23–26), which uses sequence-dependent Ramachandran maps to predict native structures and folding pathways. Moreover, our experimental TSE for NuG2b proves to be in partial agreement with all-atom simulations (21).

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# Results

**ψ** Analysis. A total of 28 biHis sites were individually introduced into Protein G and NuG2b at locations designed to probe the TSE for the presence of strand-strand pairings, helix formation, and a long-range contact (Fig. 1). The addition of zinc or nickel ions, which can coordinate the pair of histidines, alters the protein's stability and activation free energy for folding ( $\Delta\Delta G_{eq}$ and  $\Delta\Delta G_{f}$ , respectively) due to differences in binding and disassociation constants  $K^{DSE}$ ,  $K^N$ , and  $K^{TSE}$  for the denatured state ensemble (DSE), native state ensemble (NSE or N), and TSE

# Significance

An outstanding issue in protein science is identifying the relationship between sequence and folding, e.g., do sequences having similar structures have similar folding pathways? The homologs Proteins G & L have been cited as a primary example where sequence variations dramatically affect folding dynamics. However, our new results indicate that the homologs have similar folding behavior. At the highest point on the reaction surface, the pathways converge to similar ensembles. These findings are distinct from descriptions based on the widely used mutational  $\phi$  analysis, partly due to nonnative behavior. Our study emphasizes that significant challenges remain both in characterizing and predicting transition state ensembles even for relatively simple proteins whose folding behavior is believed to be well understood.

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Fig. 1.  $\psi_0$  and  $\varphi_{biHis}$  values for the biHis mutations. NC, noncanonical  $\psi_0$  values where  $\Delta\Delta G_{eq} \rightarrow 0$  and  $\Delta\Delta G_f \neq 0$  on addition of metal ions, such that  $\psi_0 \rightarrow \pm \infty. \ \varphi_{biHis}$  values for which  $\left| \Delta \Delta G_{eq}^{biHis} \right| < 0.3$  kcal/mol are not shown.

(*SI Materials and Methods* and Fig. S1). The ion-induced changes in the folding rate and stability are used to define the  $\psi$  value, a parameter analogous to the standard mutational  $\phi$  value, with  $\psi$  being the instantaneous change in  $\Delta\Delta G_{\rm f}$  relative to  $\Delta\Delta G_{\rm eq}$ 

$$\phi_{mutation} = \frac{\Delta \Delta G_{\rm f}}{\Delta \Delta G_{\rm eq}} \Big|_{mutation}; \quad \psi = \frac{\partial \Delta \Delta G_{\rm f}}{\partial \Delta \Delta G_{\rm eq}} \Big|_{\Delta \Delta G_{\rm eq}}.$$
 [1]

Any potential artifacts related to the alteration of the folding behavior by the metal ion binding are alleviated by evaluating  $\psi$  in the limit of zero perturbation

$$\Psi_{0} \equiv \frac{\partial \Delta \Delta G_{\rm f}}{\partial \Delta \Delta G_{\rm eq}} \bigg|_{\Delta \Delta G_{\rm eq}=0} = \frac{e^{\Delta \Delta G_{\rm f}} \left( \left[ {\rm Me}^{2+} \right] \right) / RT - 1}{e^{\Delta \Delta G_{\rm eq}} \left[ {\rm Me}^{2+} \right] / RT - 1}.$$
 [2]

As defined,  $\psi_0$  reflects the intrinsic degree of contact formation in the TSE in the absence of metal ions. This ability to calculate  $\psi$  in the limit of vanishing metal ion concentration provides information on the conformation of the TSE before any ioninduced perturbation.

 $\psi_0$  values of zero or unity indicate that the ion binding affinity of the biHis site is the same as found in the unfolded or native site, respectively. These two behaviors are interpreted as the biHis site being absent or native-like in the TSE, respectively. A fractional  $\psi_0$  value indicates that the biHis site either is nativelike in a subpopulation of the TSE or contains nonnative binding affinity (e.g., a distorted site with less favorable binding geometry or a flexible site that must be restricted before ion binding), or some combination thereof (18–20, 27).  $\psi_0$  values greater than unity are possible and can reflect the presence of the biHis site in the TSE but with a stronger affinity for ion binding than the native state. Mutational  $\phi_{biHis}$  values also are calculated for each biHis site using double mutant data (in the absence of metal ions) and the WT protein data as a reference point.

Structural Variations Within a Common TSE Topology. The pattern of  $\psi_0$  values indicates that the three homologs share a common TSE topology. Each TSE features interactions among the four strands to varying extents (Figs. 1 and 2, Figs. S2-S4, and Tables S1 and S2). Notably,  $\psi_0$  values for biHis sites within the hairpins are typically higher than for sites on  $\beta 1 + \beta 4$  bridging the two hairpins. At least one significant  $\psi_0$  value is present for each of the strand-strand pairings for Protein G and NuG2b, indicating that all three interstrand interactions are present in the respective TSEs. Both hairpins in NuG2b contain at least one near-unity  $\psi_0$  value, whereas the interhairpin  $\psi_0$  value is 0.8 at sites k and l. Protein G exhibits two near-unity  $\psi_0$  values on its C-terminal hairpin ( $\psi_0 = 0.9$  for sites *h* and *i*) and another high value between the hairpins ( $\psi_0^{\text{Site } k} = 0.7$ ). A noncanonical  $\psi_0$  value (where  $\psi_0 \notin [0,1]$ ) occurs for site *b* in Protein G ( $\psi_0^{\text{Site } b} = -5.1$ ). This result coupled with the nearly vanishing  $\psi_0$  values at sites a, *c*–*e*, and *n* implies that the N-terminal hairpin is partially formed in the TSE and has nonnative interactions.

The results for site *b* in Protein G, which is located in the middle of the hairpin, are particularly informative as they indicate the presence of nonnative interactions in the TSE. Both folding and unfolding rates diminish approximately fivefold for this site on the addition of 1 mM Zn<sup>2+</sup> (Fig. 3), indicating that the free energy of the TSE increases by 1 kcal/mol relative to both the NSE and DSE, whereas the stability of the native state is effectively unchanged ( $\Delta\Delta G_{eq} < 0.2$  kcal/mol). This unusual behavior is explained by the formation of a binding site with similar affinity in both the NSE and the DSE ( $K^{N} = 23 \pm 1 \ \mu M$ ;  $K^{DSE} = 33 \pm 2 \ \mu M$ ), but the site in the TSE has nonnative character and an ~10-fold weaker binding affinity ( $K^{TSE} = 333 \pm 38 \ \mu M$ ).

The nearly vanishing  $\psi_0$  and  $\phi_{\text{biHis}}$  values for the helical sites indicate that the helix is only weakly formed or absent within Protein G's TSE. This finding mirrors previous observations derived for Protein L from both  $\psi$  (17) and  $\phi$  analyses (12). Despite having nearly the same sequence as Protein G, NuG2b's helix is present to a greater degree in its TSE. We infer that the lower helical content of Protein G's TSE is related to it having a poorer helix-hairpin interface due to the presence of the nonnative N-terminal hairpin.

The similarity of the fractional  $\psi_0$  (0.2–0.3) and  $\phi_{\text{biHis}}$  values (0.3–0.6) for the three exterior sites along NuG2b's helix is consistent with most of the helix being folded approximately one third of the time in a rapid equilibrium between docked and unfolded conformations (corresponding to a  $K_{\text{eq}} = [\text{docked}]/[\text{unfolded}] \sim 1/2$  within the TSE). Alternatively, the helix could be present but distorted in a more homogenous TSE, as observed for Protein A (28).

Notably, the global chain topologies within the TSEs for Protein G and NuG2b are similar. Insertion of a biHis site between the center of the  $\beta 2$  strand and a residue that becomes helical in the native state yields similar  $\psi_0$  values ( $\psi_0^{\text{Site }m} = 0.2$ ) for the two proteins, whereas  $\phi_{\text{biHis}}^{\text{Site }m} = 0.33$  and 0.74 for Protein



Fig. 2. Folding landscape of Proteins G & L and NuG2b



**Fig. 3.**  $\psi$  values for two unusual sites.  $\psi$  values can be calculated from the denaturant dependence of a biHis site in the absence and presence of 1 mM  $Zn^{2+}$ . The addition of  $Zn^{2+}$  to site *b* of the N-terminal hairpin of Protein G slows folding and unfolding rates equally, indicating that the site has nonnative properties in the TSE. Site *e* in the C-terminal hairpin of NuG2b experiences destabilization with increasing metal ion concentration, both in the native state and in the TSE by a similar amount, which produces a near unity  $\psi_0 = 0.8$ .

G and NuG2b, respectively. These data indicate that the overall fold is formed in the TSE for both proteins even though the helix is largely unfolded in Protein G's TSE.

In Silico Folding. We conducted folding simulations using *TerltFix* (17, 23, 25, 26, 29), our homology-free,  $C_{\beta}$ -level folding program that uses realistic sampling of the Ramachandran dihedral angles and authentic backbone H-bonding. Its Monte Carlo (MC) search strategy uses the principle of sequential stabilization to iteratively promote the formation of tertiary contacts and H-bonds across multiple rounds of folding. Each round involves ~1,000 individual MC simulations that are analyzed to identify consensus interactions and backbone geometries, which are incorporated as energetic biases in subsequent rounds of folding. This iterative process continues until the consensus properties converge. In addition, the multiround nature identifies potential intermediate species, albeit without an explicit time scale.

A similar evolution of structure is found for the three homologs (Fig. 4). Although only nascent structures are observed at the end of the first round, the four strands and the helix become identifiable by the end of round 2. Very native-like structures appear at the end of round 3 where the algorithm has converged.

The folding behavior, however, does vary between the three homologs, specifically in their ability to form the native hairpins. The most accurate structure generated for NuG2b is very close to the native structure ( $C_{\alpha}$ -RMSD < 2 Å), whereas the best predictions for Proteins G & L (17) are not nearly as good ( $C_{\alpha}$ -RMSD ~ 4–5 Å).

The success for NuG2b and seemingly weaker performance for the other two proteins lies in the latter pair's lower backbone propensities for formation of their native turns (Fig. 5). *TerItFix*'s predictions for both of NuG2b's hairpins are good, e.g.,  $C_{\alpha}$ -RMSD = 0.8 and 1.0 Å across residues K5-T18 and E43-T56, respectively. Likewise, Protein G's C-terminal hairpin is well predicted with  $C_{\alpha}$ -RMSD = 0.8 Å for E42-T55.

However, Protein G's N-terminal turn region is not as well described. The native state adopts a type I turn involving residues K10 and T11, but the Ramachandran sampling distributions strongly favor the formation of a nonnative type I' turn involving N8 and G9 (Fig. 5). Consequently, the nonnative turn outcompetes the native form in the simulations, and the predicted structure contains a two-amino-acid register shift with an RMSD to the native state of 5.4 Å across K4-T17. A very similar result occurs for the C-terminal hairpin for Protein L (17). The nonnative register shifts observed in silico for Proteins G & L rationalize the noncanonical and the nearly vanishing  $\psi_0$  values observed for the relevant hairpins, in particular, for Protein G ( $\psi_0^{Site b} = -5.1$  and  $\psi_0^{Site a} = 0$ ).

Nauli et al. (15) modified Protein G to encourage the N-terminal hairpin to adopt a type I' turn. The ensuing design, NuG2, thus avoids the conflicting turn preferences present in the WT protein (Fig. 5). With this redesign, both NuG2b hairpins adopt native-like geometries in the *TerItFix* simulations and the experimental TSE, and the predicted structure is better compared with results for the other two homologs.

Despite not reflecting true kinetics, *TerItFix* is capable of predicting the order of folding events. By the end of round 2, the diversity of contacts and H-bonds is greatly diminished, and the predicted ensemble becomes more homogeneous. Therefore, we analyze the round 2 structures for comparison with the experimental data. Candidate structures from round 2 are culled based on the observation that the TSEs of two-state folders adopt a high fraction of the native topology, as defined using the relative contact order (RCO) parameter,  $\text{RCO}^{\text{TSE}} \sim 0.7 \cdot \text{RCO}^{\text{N}}$  (17, 30, 31). The culled structures are clustered, and the two largest clusters are considered potential members of the TSE.

The largest cluster (22%) for Protein G contains the N-terminal hairpin in a nonnative geometry and docked to an incompletely formed C-terminal hairpin. The helix is present in both clusters, contrary to the experimental findings. The two major clusters for NuG2b contain native-like hairpins that fold before docking, as also seen in the simulations for Protein G. The largest cluster includes structures with multiple docking poses for the two hairpins, but not necessarily in the native registry. The helix in NuG2b's TSE is found to be partially to fully folded. The results for NuG2b are generally consistent with the experimental  $\psi$  values.

**Comparison with DESRES Trajectories for NuG2b.** We also analyzed the all-atom MD trajectories for NuG2b taken from the landmark study of Shaw and coworkers (21). The trajectories for this protein contain 13 discrete folding and 14 unfolding transition paths (TPs) between the NSE and the DSE (Fig. S5). The DSE is described by the simulations as collapsed and highly H-bonded, whereas experimentally, the DSE is expanded and devoid of



**Fig. 4.** TerltFix simulations. (*A*) Evolution of Ramachandran angles and secondary structure from the initial sampling library to the end of round 3 (color coded according to Ramachandran basin). (*B*) Fraction of residues in each hairpin forming extended structure. (*C*) Possible TS structures obtained from the two largest clusters at the end of round R2 (centroids).



**Fig. 5.** Differences in the Ramachandran propensities of the N-terminal hairpin in Protein G and NuG2b. The dihedral angles of N8 and G9 in Protein G have high propensities for the nonnative type I' turn, whereas K10 and T11 yield low propensities for the native type I turn. NuG2b eliminates the competition by removing the K10-T11 turn and allowing the N8-G9 pair to take advantage of their high propensity for a type I' turn, which becomes the native turn in this designed protein.

measurable H-bonding (32). Nevertheless, we examined the simulations to identify the sequence of structure formation along the TPs for comparison with experiment.

The helix is at least partially formed across all 27 TPs, but the degree of  $\beta$  strand formation is heterogeneous. The  $\beta$ 4 strand in 14 TPs is docked against the N-terminal hairpin, but the C-terminal hairpin is absent (Fig. S5). Five TPs largely agree with the experimental data in that both hairpins are formed, although the degree of hairpin-hairpin contact often is lower in the TP than indicated by the  $\psi$  values. Another five TPs only contain a formed N-terminal hairpin formed.

A mean folding TP is generated by averaging the 13 folding TPs (as defined in ref. 21) after normalizing the reaction coordinate of each TP to begin and finish at 0 and 1, respectively (Fig. S6). The N-terminal hairpin is already folded in the DSE before any progression along the mean TP. Interestingly,  $\beta4$  docks to the N-terminal hairpin in a nonnative, antiparallel orientation near the beginning of the TP, but adopts the native parallel orientation by the end of the TP, suggesting that this change in topology is a critical folding event.  $\beta3$  does not fold until the end of the TP, if at all. The helix is formed at approximately the level indicated by the  $\psi$  values. The major difference between the mean TP and the experimental data are the formation of the C-terminal hairpin only after the TP in the simulations. A P<sub>Fold</sub>-style analysis was conducted using all 27 TPs to identify a 328 member TSE<sup>MD</sup> having 0.4 < P<sub>Fold</sub> < 0.6 (Fig. S7 and *SI Materials and Methods*). The average structural content in the TSE<sup>MD</sup> is consistent with the analysis of the mean TPs.

### Discussion

Our experimental data indicate that the TSEs of three homologous  $\alpha/\beta$  proteins, Proteins L & G and NuG2b, adopt a similar four-stranded structure (Fig. 2). These findings contrast with the long held view that this family possesses small, polarized TSEs whose structure is strongly sequence dependent (1–16). Despite the conserved topology, sequence does exert notable effects. The TSE of Protein G contains an N-terminal hairpin with nonnative

features. Protein L similarly contains a nonnative turn in its TSE, albeit at the C terminus (17). According to the  $\psi$  values and *TerItFix* folding simulations, these features are due to alternative turn geometries in the TSE with a two-amino-acid register shift. The nonnative properties are not present in the TSE of NuG2b for both experiments and the *TerItFix* simulations, consistent with the design goal of Nauli et al. of a less frustrated N-terminal hairpin with a single preferred geometry (15). The helix is present in the NuG2b's TSE but not in Protein G or Protein L.

Nonnative interactions provide a partial explanation for the differences in the TSE and folding rate between the three proteins. The helical amino acid sequence of Protein G and NuG2b are nearly identical with the same low average helical propensity (5.4–5.5%) (33). Given this similarity, and the presence of the helix and the two native-like  $\beta$  turns only in NuG2b's TSE, we suggest that two native-like hairpins are required to create a hydrophobic surface suitable for docking the helix. Without the two native-like turns in the TSE of the naturally occurring proteins, the helix remains unfolded in their TSE and the kinetic barrier is higher.

The TSEs of Protein G and NuG2b both contain a tertiary contact between one of the outer strands ( $\beta$ 2) and a central residue in the segment that becomes helical in the native state (this aspect was not investigated for Protein L). Hence, the folding of both Protein G and NuG2b converges to a late TSE with a native-like topology.

Overall, we believe that the folding behavior of the homologs and other proteins can be explained by a common mechanism, the principle of sequential stabilization (34, 35). Here, pieces of H-bonded structure, or foldons, template onto existing H-bonded structure and often bury a commensurate amount of hydrophobic surface. This templating occurs both on the route up to the TSE (20) and on the descent down (34, 35). The incremental buildup of secondary and tertiary structure mostly produces native- or unfolded-like regions, as suggested by the frequent observation of  $\psi = 0$  or 1 and the cooperative pattern of hydrogen exchange (HX) protection factors within secondary structures (36-39). Folding steps can involve both local and nonlocal contacts and H-bonds even during the early stages of folding. This view differs from models that either favor the folding of one class over the other, such as secondary structure formation followed by hydrophobic collapse or vice versa, or ones that stress long-range side-chain contacts before secondary structure formation.

 $\psi$  and  $\phi$  Analyses in the Homologs and Other Proteins. The differences between our study and previous studies arise in part because of our use of  $\psi$  analysis as opposed to  $\phi$  analysis. The primary variance between the two methods is that  $\psi$  analysis directly probes residue-residue contacts between two known partners, whereas  $\phi$  analysis uses energetic perturbations to infer structure. This inference can be challenging because the perturbations introduced by mutations may be the consequence of multiple factors, including changes in side-chain interactions and backbone dihedral propensities. In addition,  $\phi$  values can underreport the structural content of the TSE if the TSE relaxes energetically (40) or involves nonnative features (41–44).

Another situation where  $\phi$  analysis can underreport structure occurs when a residue's side chain is buried in the native state but not in the TSE due to a portion of the protein being unfolded. This situation applies to residues on the hydrophobic face of the four  $\beta$  strands in Proteins G & L as the helix is absent in their TSEs. As a result, a substitution on a strand can yield a smaller energy signature in the TSE than in the native state. Consequently, small  $\phi$  values are observed even for residues participating in the sheet, leading to erroneous inferences about the degree of sheet structure in the TSE of these two proteins. This issue, along with relaxation of the TSE, applies to  $\beta$  sheet sites in other proteins including ubiquitin, e.g., where a value of  $\phi^{L67A} = 0$  is found for a position that is structured in the TSE according to  $\psi$  analysis (19). We believe these and other factors lead to many  $\phi$  values for structured regions in the TSE being in the range of 0.2–0.5, rendering them difficult to interpret. In fact,  $\phi$  analysis has been found to underreport the structure and topology of the TSE in all cases where both  $\phi$  and  $\psi$  analyses have been performed, namely for acyl phosphatase (45, 46), ubiquitin (19, 31), the B domain of Protein A (28), Protein L (17), Protein G, and NuG2b (see figure 6 in ref. 17). We suspect underreporting also occurs with other proteins, particularly those characterized as having a polarized TSE, such as cold shock protein (47) or src SH3 (48). Overall, the ambiguities in the interpretation of low to moderate  $\phi$  values probably has led to an unrealistically diverse range of folding models and mechanisms, as well as to an overestimation of the magnitude of sequence effects, as demonstrated here for the Proteins G & L homologs.

The consistent theme of extensive TSE structure implied by the  $\psi$  values provides additional support for its use in identifying folding principles. The TSEs of the six globular proteins studied using  $\psi$  analysis share a common and high degree of native topology, RCO<sup>TSE</sup> ~ 0.7•RCO<sup>N</sup>. This finding rationalizes the well-known correlation between  $k_f$  and RCO (49). In contrast, the TSE deduced from  $\phi$  analysis often barely defines a protein's fold and the ensuing RCO levels of the TSE are variable for different proteins.

Furthermore, whereas a 1:1 relationship between H-bond content and surface burial is found in the TSEs of a variety of proteins (50, 51), the H-bond content of the  $\phi$ -determined TSE for the Proteins G & L homologs is inadequate to match the ~80% surface burial  $(m_{f}/m_{0})$  in the TSE. A recent transfer study by Record and coworkers (52) supports our conclusion based on  $\psi$  analysis that the TSEs of many proteins have a substantial level of H-bonded structure.

The binding of increasing concentrations of ions in  $\psi$  analysis produces a continuous increase in the stability of TSE structures that contain the biHis site. Hence, stability is perturbed in an isosteric and isochemical manner. The resulting series of data can be justifiably combined, and the  $\psi_0$  value can be extracted, devoid of any perturbation due to ion binding. This ability to extrapolate to zero ion concentration addresses a potential misconception that metal binding induces structure in the TSE and, therefore, biases the outcome.

The implementation of  $\psi$  analysis using biHis sites does have some issues, however. The biHis sites are limited to surface positions. Furthermore, the introduction of the two histidines can be destabilizing ( $<\Delta\Delta G^{\text{biHis}} > P_{\text{rotein }G, NuG2b} = -1.3 \pm 0.8$ kcal/mol), just as any substitution may be when implementing  $\phi$ analysis (particularly as large values of  $\Delta\Delta G$  often are viewed as necessary for accuracy) (53).

Fractional  $\psi$  values raise the same issues of interpretation as fractional  $\phi$  values, including the possibility that they arise from either TS heterogeneity or partial structure formation (19). Nevertheless (and significantly), the conclusion that the  $\psi$ -determined TSE has near-native topology emerges even when only the sites with near-unity  $\psi$  values are considered.

As NuG2 was designed to shift the TSE from the C- to the N-terminal hairpin by resolving the nonnative behavior (15), those results warrant some discussion. The  $\phi$  values were determined in the background of a variant already having a destabilizing hairpin mutation, D46A, i.e., the analysis focused on the NuG2<sup>D46A</sup> variant rather than NuG2 itself. The D46A mutation destabilizes the C-terminal hairpin by removing a side-chain to backbone H-bond between D46 and A48 and a possible H-bond between D46 and T49 ( $\Delta\Delta G^{D46A} = -1.5$  kcal/mol). In the D46A background, the T49A substitution has a reduced kinetic effect that can explain the decrease in  $\phi^{T49A}$  from 1.1 in Protein G to 0.3 in NuG2<sup>D46A</sup>, rather than the actual absence of the hairpin in the TSE of WT NuG2. In fact,  $\phi^{D46A} = 0.6$  for NuG2 (using values in table 2 in ref. 15). Hence, we believe that the prior data are consistent with both hairpins being present in NuG2's TSE.

**Pathway Diversity.** The mechanism of sequential stabilization produces few low energy routes, particularly for proteins with nested or asymmetric folds. Multiple pathways are possible (54) for symmetric proteins, although energetic heterogeneity due to sequence differences can reduce the degree of pathway diversity (55). Hence, even for symmetric folds, a given sequence may have a major route, but the entire family may traverse different routes due to sequence variation.

This multipath scenario may be occurring with the Proteins L & G homologs, where alternative routes may be traversed up to the TSE. Either hairpin can form before the other, with the relative flux being influenced by the hairpins' relative stabilities. Potentially, one hairpin might form along with the adjoining strand before the formation of the other hairpin (e.g.,  $\beta 2 + \beta 1 + \beta 4 \rightarrow \beta 2 + \beta 1 + \beta 4 + \beta 3$ ). Both types of pathways appear in the *TerltFix* and all-atom simulations, although generally the coarse-grained simulations describe the hairpin formation as arising independently, whereas the all-atom simulations typically follow the three-strand motif pathway. The helix of NuG2b may fold before the folding of both hairpins, as all three elements can be found in the experimental TSE. However, we suspect that this possibility does not occur because the helical sequence is nearly identical to Protein G's and the helix forms after the four strands in Proteins G & L.

In two classes of pseudo-1D proteins, coiled coils (56, 57) and repeat proteins (58–60), local energetic differences alter the location of the TS nucleus and reduce the extent of pathway degeneracy. The TSEs of IgG-like domains exhibit some structural diversity but share a common nucleus that can shift along the strands (2) or be localized to a subset thereof for one homolog having parallel unfolding pathways (61). The variable pattern of  $\phi$  values for engrailed homeodomains (62) and spectrin domain families (2) has been interpreted as a change in folding mechanism. Our  $\psi$  studies find that the TSE of Protein A, a small three-helix bundle, converges to an ensemble involving all three helices and with the terminal helices forming contacts that define the overall fold (28). As mentioned above, the general RCO<sup>TSE</sup> ~ 0.7•RCO<sup>N</sup> trend suggests that other three helix bundles have similar TS topologies.

In addition to changes in the TSE, the protein sequence can influence the energy landscape of homologs by altering the energetics of intermediates (2). A partially misfolded intermediate accumulates in the folding of Im7, but not its homolog, Im9 (63, 64). HX studies indicate that the intermediates are different for meso- and thermophilic versions of Rnase H (65). Hence, pathway diversity is not limited to symmetric folds.

## Conclusion

The folding behavior of the Proteins L & G and NuG2b has been widely viewed as the major example of sequence variation influencing TS structure. However, our application of  $\psi$  analysis reveals that the homologs fold through a similar and nonpolarized TSE having near-native topology. The variability in the TSE mostly relates to helix formation and likely arises from nonnative turn propensities for the naturally occurring proteins. This study and prior studies emphasize that even for small proteins such as these  $\alpha/\beta$  proteins, as well as for the three helix bundle Protein A (28), considerable challenges remain in correctly characterizing and predicting TSEs. Furthermore, integrated approaches, such as the present combination of  $\psi$  analysis with *TertItFix* and all-atom simulations, often are necessary for accurately describing the folding process.

### **Materials and Methods**

Sample Preparation. BiHis sites were inserted into the WT plasmid using the Quikchange protocol and prepared according to ref. 17.

**Folding Kinetics.** Kinetic data were collected at 10–20 μM protein concentration in 50 mM Hepes and 100 mM NaCl, pH 7.5, at 20 °C using a BioLogic SFM400/40000 stopped-flow apparatuses connected to a PTI A101 arc lamp. Further descriptions of the methods are listed in *SI Materials and Methods*.

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