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# Similarity and Difference in the Unfolding of Thermophilic and Mesophilic Cold Shock Proteins Studied by Molecular Dynamics Simulations

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ABSTRACT Molecular dynamics simulations were performed to unfold a homologous pair of thermophilic and mesophilic cold shock proteins at high temperatures. The two proteins differ in just 11 of 66 residues and have very similar structures with a closed five-stranded antiparallel  $\beta$ -barrel. A long flexible loop connects the N-terminal side of the barrel, formed by three strands ( $\beta 1-\beta 3$ ), with the C-terminal side, formed by two strands ( $\beta 4-\beta 5$ ). The two proteins were found to follow the same unfolding pathway, but with the thermophilic protein showing much slower unfolding. Unfolding started with the melting of C-terminal strands, leading to exposure of the hydrophobic core. Subsequent melting of  $\beta 3$  and the  $\beta$ -hairpin formed by the first two strands then resulted in unfolding of the whole protein. The slower unfolding of the thermophilic protein could be attributed to ion pair formation of Arg-3 with Glu-46, Glu-21, and the C-terminal. These ion pairs were also found to be important for the difference in folding stability between the pair of proteins. Thus electrostatic interactions appear to play similar roles in the difference in folding stability and kinetics between the pair of proteins.

# INTRODUCTION

Understanding the mechanisms of protein folding and unfolding, and the structural determinants of protein stability has been the subject of intensive experimental and theoretical studies over the past several decades (1-6). Cold shock proteins have served as a good model system for such studies (7-35). The protein from the thermophile Bacillus caldolyticus (Bc-Csp) and cold shock protein B from the mesophile Bacillus subtilis (Bs-CspB) were both found to undergo reversible two-state folding, with an energetically polarized transition state according to  $\Phi$ -value measurements (9,10, 12,22,23,31). These two proteins differ in only 11 of 66 residues, and their three-dimensional structures show high similarity with a closed five-stranded antiparallel  $\beta$ -barrel capped by a long flexible loop (7,8,15,21) (Fig. 1). Yet, the thermophilic protein unfolds 20 times more slowly (10,22). There is also a significant difference in folding stability between the two proteins, with melting temperatures at 77°C and 54°C, respectively (20). Mutational studies led to the conclusion that surface charges, especially around residue 3 (occupied by Arg in Bc-Csp but Glu in Bs-CspB), play major roles in the stability difference (20). Using electrostatic calculations, we have provided quantitative rationalizations for the effects of individual and multiple substitutions and salts on the stability of the two proteins (29,34). This study aims to explain the similarity and difference in the unfolding kinetics of the two proteins, through molecular dynamics (MD) simulations at high temperatures.

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MD simulations can provide a realistic view of the folding and unfolding process (36–41). High-temperature simulations have been shown to be a robust denaturing protocol for sampling conformational changes in the unfolding process (5,36,42–50). In this study, we have followed the unfolding of Bc-Csp and Bs-CspB at 500, 550, and 600 K. All three simulations showed the same sequence in the melting of the five  $\beta$ -strands: the two C-terminal strands ( $\beta$ 4– $\beta$ 5) followed by  $\beta$ 3 and then by the  $\beta$ -hairpin formed by  $\beta$ 1 and  $\beta$ 2. However, the unfolding of the thermophilic protein Bc-Csp was much slower. The main features of the simulations thus well reproduced the experimental results of Schmid and coworkers (22,31).

The simulations suggest that the tight turn between  $\beta 1$  and  $\beta 2$  helps stabilize these two strands and contributes to their resistance to melting. The slower unfolding of the thermophilic protein could be attributed to ion pair formation of Arg-3 with Glu-46, Glu-21, and the C-terminal, echoing the role of the ion pairs in the elevated folding stability of Bc-Csp over its mesophilic counterpart. Turn structure and tertiary contacts have been found to play prominent roles in the folding/unfolding of many  $\beta$ -proteins (51–60). Here the parallel study of a pair of homologous proteins provides further insight on the interplay of native architecture, turn stability, and tertiary contacts in the folding of  $\beta$ -proteins.

#### COMPUTATIONAL METHODS

All the MD simulations were performed on an IBM SP4 supercomputer by using the SANDER module of AMBER 7.0 (61). The water model was TIP3P (62,63). The lengths of bonds involving hydrogen atoms were constrained with the SHAKE program (64). The particle mesh Ewald method (65–68) was used to treat long-range electrostatic interactions. A 9-Å cutoff for nonbonded interactions was used. The nonbonded list was updated whenever any atom moved more than 1 Å (half of the default width

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FIGURE 1 Comparison of sequence and structure between *B. caldolyticus* cold shock protein (Bc-Csp) and *B. subtilis* cold shock protein B (Bs-CspB). PDB entries for the two proteins were 1c90 (15) and 1csp (7), respectively.

of the nonbonded "skin" parameter) since the last list update. The weakcoupling method (69,70) was used to couple the system to a thermal bath of different temperatures (300, 500, 550, or 600 K). The system center of mass motion was repositioned at every picosecond. Simulations at 300 K were performed at constant temperature and pressure, with a time step of 2 fs. The constant temperature and pressure protocol is not feasible for the high temperatures, so simulations at 500, 550, and 600 K were carried out at constant temperature and volume, and the time step was reduced to 1 fs.

The procedures for the MD simulations were as follows. The initial structures for Bc-Csp and Bs-CspB were from Protein Data Bank (PDB) entries 1c90 (chain A) (7) and 1csp (15), respectively. Water molecules and counterions were added; the resulting system sizes are listed in Table 1. Each system was prepared by four to five cycles of energy minimization and equilibration; the minimizations were subject to successively lower constraints on the protein molecule. In the last equilibration step, the whole system targeting 300 K was gradually heated at constant temperature and pressure and equilibrated for 10 ps. The systems targeting 500, 550, or 600 K were heated at constant temperature and volume and equilibrated for 15–30 ps. Finally the MD simulations were carried out to the total times listed in Table 1. Conformations were sampled at every picosecond for later analysis. The average density in the simulation box at 300 K was 1.0 g/cm<sup>3</sup>; in comparison the average density was 0.81 and 0.83 g/cm<sup>3</sup>, respectively, for Bc-Csp and Bs-CspB in the high temperature simulations.

For each trajectory, root mean-square deviations (RMSD) of  $C_{\alpha}$  atoms from the x-ray structure were tracked. For the two 300-K trajectories, residue-based root mean-square fluctuations (RMSF) around the averaged structures and order parameters were calculated. The average structure was calculated by first removing translation and rotation through superimposing all atoms of each sampled conformation to the first conformation and then averaging the positions of the atoms. The average structure was used as the reference, and all conformations were superimposed to it. The RMSF was calculated as

$$\text{RMSF} = \left\langle \frac{1}{\text{NA}_{\text{Res}}} \sum_{j=1}^{\text{NA}_{\text{Res}}} (\mathbf{r}_j - \langle \mathbf{r}_j \rangle)^2 \right\rangle^{1/2},$$

where  $\langle \ldots \rangle$  represents time average,  $\mathbf{r}_j$  is the position vector of atom *j* at different times, and NA<sub>Res</sub> is the total number of atoms in a given residue. The order parameter was calculated as (71)

$$S^{2} = \frac{3}{2} [\langle x^{2} \rangle^{2} + \langle y^{2} \rangle^{2} + \langle z^{2} \rangle^{2} + 2(\langle xy \rangle^{2} + \langle xz \rangle^{2} + \langle yz \rangle^{2})] - \frac{1}{2},$$

where *x*, *y*, and *z* are Cartesian components of the unit vector along the backbone N-H bond of a residue. Again, all conformations were superimposed to the average structure, but here only the backbone atoms (N,  $C_{\alpha}$ , and C) were used for superposition.

For the high-temperature trajectories, the secondary structures were tracked to monitor unfolding. Secondary structures were calculated using the DSSP program (72). In the native structures of Bc-Csp and Bs-CspB, the five  $\beta$ -strands consist of residues 2–10, 15–19, 26–29, 46–54, and 47–65. These were labeled as  $\beta$ 1– $\beta$ 5 in this work. In addition, the four residues between  $\beta$ 1 and  $\beta$ 2 form a tight turn. In the output of DDSP,  $\beta$ -structure is indicated by the letter "E", and turn is indicated by "T". For each sampled conformation, the unmelted fractions of the segments corresponding to the five native  $\beta$ -strands and the tight turn were calculated.

#### RESULTS

### Overall conformational fluctuations and transitions

Four parallel simulations were carried out for the pair of thermophilic and mesophilic proteins at temperatures of 300, 500, 550, and 600 K in explicit water. The  $C_{\alpha}$  RMSD of the two proteins along six trajectories are shown in Fig. 2. At room temperature, the two proteins showed small deviations (~2 Å) from their x-ray structures. In contrast, the RMSD at the high temperatures reached 16 Å, indicating complete

| TABLE 1 | Setup of the MD simulations | on B. caldolyticus cold shock | protein (Bc-Csp) and B. | . subtilis cold shock protein B ( | Bs-CspB) |
|---------|-----------------------------|-------------------------------|-------------------------|-----------------------------------|----------|
|         | •                           |                               | • • • • • •             | • •                               |          |

| Proteins                       | Bc-Csp<br>1c9oA          |                          |                          | Bs-CspB<br>Icsp      |                      |                      |  |
|--------------------------------|--------------------------|--------------------------|--------------------------|----------------------|----------------------|----------------------|--|
| PDB                            |                          |                          |                          |                      |                      |                      |  |
| Temperature                    | 300 K                    | 500 K                    | 600 K                    | 300 K                | 500 K                | 600 K                |  |
| Protein atoms                  | 1,020                    | 1,020                    | 1,020                    | 1,014                | 1,014                | 1,014                |  |
| Counterions (Na <sup>+</sup> ) | 2                        | 2                        | 2                        | 6                    | 6                    | 6                    |  |
| Water                          | 4,375                    | 10,350                   | 10,350                   | 4,722                | 11,095               | 11,095               |  |
| Total atoms                    | 14,147                   | 32,072                   | 32,072                   | 15,186               | 34,305               | 34,305               |  |
| Box size (Å <sup>3</sup> )     | $55 \times 50 \times 51$ | $77 \times 71 \times 72$ | $77 \times 71 \times 72$ | 55 	imes 50 	imes 55 | 76 	imes 71 	imes 76 | 76 	imes 71 	imes 76 |  |
| Ensemble                       | NTP                      | NTV                      | NTV                      | NTP                  | NTV                  | NTV                  |  |
| Total time (ns)                | 12.000                   | 50.699                   | 6.00                     | 12.00                | 20.043               | 6.00                 |  |



FIGURE 2  $C_{\alpha}$  RMSD Bc-Csp and Bs-CspB from their respective x-ray structures during MD simulations at 300, 500, and 600 K. Each curve represents one trajectory. In this and later figures, all time-dependent quantities are smoothed by averaging over a 100-ps interval.

unfolding of the structures. The transition from small to large RMSD occurred much earlier at 600 K than at 500 K. Moreover, at each high temperature, the unfolding transitions of the thermophilic protein (Bc-Csp) occurred much later than the mesophilic counterpart (Bs-CspB).

Interestingly, the RMSD of Bs-CspB showed greater fluctuations than Bc-Csp even in the 300-K simulations. In both proteins, the five  $\beta$ -strands were composed of residues 2–10, 15–19, 26–29, 46–54, and 57–65, respectively. RMSF revealed that the larger fluctuations of Bs-CspB occurred mostly in the loops between  $\beta 2$  and  $\beta 3$ ,  $\beta 3$  and  $\beta 4$ ,  $\beta 4$  and  $\beta 5$ , and the C-terminal segment after  $\beta 5$  (Fig. 3). In both proteins, these regions were much more flexible than the five  $\beta$ -strands. The tight turn between  $\beta 1$  and  $\beta 2$  was also quite stable in both proteins, exhibiting RMSF just slightly larger than those of the  $\beta$ -strands. These findings are also apparent



FIGURE 3 RMSF and order parameters ( $S^2$ ) for the residues of Bc-Csp and Bs-CspB, calculated from the simulations at 300 K.

#### Melting of secondary structural elements

Further details of the unfolding process of the two proteins were provided by tracking the melting of the five  $\beta$ -strands. Fig. 4 shows the unmelted fractions of the five  $\beta$ -segments in Bc-Csp and Bs-CspB as a function of time at 500 K. Comparing the two proteins, the secondary structures of Bc-Csp took ~35 ns to completely melt, whereas the secondary structures of the mesophilic counterpart took a much shorter period, ~13 ns, to melt. On the other hand, the melting of the five  $\beta$ -strands occurred in the same order in the two proteins. The first strands to melt were  $\beta$ 4 and  $\beta$ 5, occurring at ~12– 18 ns in Bc-Csp and between 3–8 ns in Bs-CspB. This was followed by  $\beta$ 3, with melting occurring at ~20 ns in



FIGURE 4 Fraction of native secondary structure for the five  $\beta$ -segments and the turn between  $\beta 1$  and  $\beta 2$ , as a function of simulation time at 500 K for (*A*) Bc-Csp and (*B*) Bs-CspB. The  $\Phi$ -values for folding of the two proteins are shown in *C*, taken from Table 1 of Perl et al. (22) for Bc-Csp and Table 3 of Garcia-Mira et al. (31) for Bs-CspB. In the latter case, the reference for calculating  $\Phi$ -values was the GluE3Leu mutant, and the result at position 3 is for the mutation back to the wild-type (i.e., with Glu at position 3).

Bc-Csp and  $\sim 9$  ns in the mesophilic protein. Finally the two N-terminal strands appeared to melt together.

That the two N-terminal strands  $\beta 1$  and  $\beta 2$  melted together prompted us to examine the status of the tight turn between them. As Fig. 4 shows, this turn was disrupted at the same time as the two  $\beta$ -strands in both proteins. Thus the two strands and the connecting turn existed as a cooperative unit. Some turn population even persisted after the melting of the two  $\beta$ -strands melted.

The melting of secondary structures at 600 K showed the same sequence of events as for 500 K, but with a much faster pace (Fig. 5). Again the melting of  $\beta$ 4 and  $\beta$ 5 (at ~1.5 ns in Bc-Csp and  $\sim 1$  ns in Bs-CspB) was followed by the melting of  $\beta$ 3 and  $\beta$ 1- $\beta$ 2 (at ~4.5 ns in Bc-Csp and ~2 ns in Bs-CspB). The same melting sequence was also observed in parallel simulations at 550 K (data not shown). Taking all the high-temperature simulations together, it appears that the unfolding of the pair of proteins occurs in two distinct stages, the first for the melting of the two C-terminal  $\beta$ -strands and the second for the melting of the three N-terminal  $\beta$ -strands. For example, the first stage covered 0–18 ns in Fig. 4 A and 0-8 ns in Fig. 4 B, and the second stage covered 18-35 ns in Fig. 4 A and 8–13 ns in Fig. 4 B. That the N-terminal  $\beta$ -strands remained largely intact for an extended period of time after the melting of the two C-terminal strands suggests a transition state for folding with a partially structured N-terminal  $\beta$ -sheet and an unstructured C-terminal region. Such a transition state is consistent with observations of relatively high  $\Phi$ -values for folding in the N-terminal



FIGURE 5 Fraction of native secondary structure for the five  $\beta$ -segments and the turn between  $\beta 1$  and  $\beta 2$ , as a function of simulation time at 600 K for Bc-Csp and Bs-CspB.

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 $\beta$ -strands and low  $\Phi$ -values in the C-terminal  $\beta$ -strands (except for Glu-46 of Bc-Csp; Fig. 4 *C*) (22,31).

### Ion pairs in the unfolding process

The unfolding of the two proteins is similar in that the same sequence of events was observed but different in that the mesophilic protein Bs-CspB showed a much higher speed of unfolding. Experimentally Bs-CspB was found to have an unfolding rate that is 20 times higher than Bc-Csp (10,22). The difference in unfolding rate must ultimately arise from the 11 substitutions between the two proteins. Since previously the difference in folding stability between the two proteins was largely attributed to differences in electrostatic interactions, especially ions pairs around Arg-3 in Bc-Csp (20,29), we wondered whether ion pairs played any role in the difference in unfolding speed observed in the simulations.

Arg-3 of Bc-Csp can potentially form ion pairs with Glu-21, Glu-46, and the C-terminal carboxyls. Fig. 6 shows the shortest distances among the positively charged atoms (NE, NH1, or NH2) on Arg-3 from negatively charged atoms on Glu-21, Glu-46, and the C-terminal (OE1 or OE2 for Glu and O and OXT for the C-terminal). In the 300-K simulation, Arg-3 was within salt-bridge distance ( $\sim$ 3 Å) from both Glu-21 and Glu-46 most of the time. At 500 K, Arg-3 also formed at least one salt bridge throughout most of the simulation. From 0 to 12 ns, salt bridges were formed with both Glu-46 and the C-terminal; the one with Glu-46 persisted till  $\sim$ 22 ns. Thereafter Glu-21 and the C-terminal formed a salt bridge with Arg-3 intermittently. The separation of the C-terminal from Arg-3 at 12 ns coincided with the melting of the C-terminal  $\beta$ -sheet, at which point the C-terminal was no longer constrained by the structure of the  $\beta$ -sheet and thus free to move away. A similar situation of salt-bridge formation around Arg-3 was also apparent in the 600-K simulation. It appears that these salt bridges serve as a clamp which helps first the C-terminal  $\beta$ -sheet and then the N-terminal  $\beta$ -sheet resist rupture. Consequently both stages of the unfolding process for Bc-Csp took a substantially longer time than for Bs-CspB.

There is some experimental evidence for the role of the Arg-3-Glu-46 salt bridge in the unfolding process. At a high temperature of 343 K, Perl et al. (22) reported a high  $\Phi$ -value (~1.5) for the Glu-46Ala mutation (Fig. 4 *C*), though the effect of the mutation appears to diminish at room temperature. The stronger effect of the mutation at the higher temperature is consistent with the expected stronger electrostatic interaction between Arg-3 and Glu-46 due to the decrease in the dielectric constant of water. However, it is also possible that electrostatic interactions are overestimated in the MD simulations, which were carried out at temperatures much higher than 343 K.

For comparison, the shortest distances in Bs-CspB between charged atoms on Glu-3 and those on Glu-21 and



FIGURE 6 Shortest distances between charged atoms of ion pair residues in Bc-Csp, calculated from MD simulations at 300, 500, and 600 K. Arrows indicate times when  $\beta$ -strands melted.

Glu-66 were also calculated (note that Glu-46 in Bc-Csp is substituted to Ala in Bs-CspB) (Fig. 7). Contrary to the situation in Bc-Csp, the like-charged Glu-3 and Glu-21 stayed far apart (9 Å or more) throughout the simulations, and the distance between Glu-3 and Glu-66 increased significantly as the simulations progressed. It thus appears that the repulsion between the negative charges helps to drive the structure of Bs-CspB apart during the unfolding process.

#### Unfolding pathway

By examining representative conformations along the unfolding trajectories, a more comprehensive picture of the unfolding pathway was obtained. As shown in Fig. 8 for Bc-Csp and Fig. 9 for Bs-CspB, the unfolding began with the bulging of  $\beta$ 5, thus partially exposing the hydrophobic core. This was followed by the complete unfolding of the C-terminal  $\beta$ -sheet, which fully exposed the hydrophobic core and further weakened the N-terminal  $\beta$ -sheet. The  $\beta$ 3 strand of the N-terminal sheet then melted away. The last two N-terminal strands, stabilized by the tight turn between them, were able to withstand unfolding for a period before capitulation.

This common unfolding pathway of the pair of proteins perhaps can be rationalized by the architecture of their common structure (Fig. 1). Between the two  $\beta$ -sheets, the



FIGURE 7 Shortest distances between charged atoms of Glu-3 and potential charge-charge repulsion partners in Bs-CspB, calculated from MD simulations at 300, 500, and 600 K. Arrows indicate times when  $\beta$ -strands melted.

C-terminal sheet is probably weaker than the N-terminal one. The latter has one additional strand and a very stable turn (see Fig. 3) between  $\beta$ 1 and  $\beta$ 2. Within the C-terminal sheet,  $\beta$ 5 is probably weaker than  $\beta$ 4, as the latter has better packing interactions with the N-terminal sheet, in particular backbone hydrogen bonds with  $\beta$ 1. Within the N-terminal strand,  $\beta$ 3 is probably the weakest strand as the other two strands are stabilized by the tight turn.

#### The unfolded state

The conformations of the proteins after all the secondary structures were melted toward the end of the MD simulations provided an opportunity to characterize the unfolded state. In particular, residual charge-charge interactions in the unfolded state have been found to be important for analyzing electrostatic effects on folding stability (29,74,75). Two extreme views of the unfolded state have been proposed. In the native-like model (74), the unfolded state is a slightly expanded version of the folded state and charged residues inherit native interactions with reduced strengths. In the Gaussian-chain model (75), charged residues lose all specific interactions and their distances are dictated by chain statistics, which results in shorter average distances for residues close along the sequence than for residues far apart along the sequence.

For illustration, in Fig. 10 we show the scatter plot of the mean square  $C_{\alpha}$ - $C_{\alpha}$  distance  $\langle r^2 \rangle$  versus the sequence



FIGURE 8 Representative conformations of Bc-Csp during the unfolding simulations at (*A*) 500 K and (*B*) 600 K. The first step of the unfolding pathway was the buckling of strand  $\beta$ 5. This was followed by the melting of the two strands in the C-terminal  $\beta$ -sheet. Subsequently  $\beta$ 2.

β5. This was followed by the melting of straid β5. This was followed by the melting of the two strands in the C-terminal β-sheet. Subsequently β3 melted and finally the β-hairpin formed by β1 and β2 was disrupted. The time of each representative conformation and its C<sub>α</sub> RMSD from the x-ray structure are indicated. The β1-β2 turn and ion pairing residues are labeled.

separation l, calculated over the unfolded portion of the Bc-Csp trajectory at 500 K. For an ideal Gaussian chain, a linear relation  $\langle r^2 \rangle = b^2 l$  is expected. This scatter plot and corresponding ones for the other high-temperature simulations indeed exhibited the expected trend. The fitting parameter b was 3.9 Å for Bc-Csp at 500 K. The value of b estimated from fluorescence resonance energy transfer efficiency of unfolded Thermotoga maritima cold shock protein at room temperature was  $\sim$ 5.6 Å (27). The conformations right after the melting of all the secondary structures thus may still be too compact to be representative of the fully unfolded state. Toward the highest l values, the scatter of  $\langle r^2 \rangle$  is below the linear fit (a result seen in all the unfolding simulations). This may be a consequence of excluded volume, which favors contacts between residues at the chain ends over those between inner residues (76).

# DISCUSSION

Our parallel study of a pair of homologous proteins has identified both similarity and difference in the unfolding. The two proteins were found to follow the same pathway of unfolding, with the N-terminal  $\beta$ -hairpin showing the greatest resistance to unfolding. On the other hand, the thermophilic protein showed much slower unfolding than its mesophilic counterpart. These major findings of this work agree well with experimental observations (22,31). We have further suggested a rationalization of the common unfolding pathway based on the architecture of the folded structure and provided an explanation for the slower unfolding of the thermophilic protein based on ion pairs formed around Arg-3.

All together we made six unfolding simulations for the two homologous proteins. Our focus was limited to the similarity and difference between the two proteins. The similarity in



FIGURE 9 Representative conformations of Bs-CspB during the unfolding simulations at (*A*) 500 K and (*B*) 600 K.

unfolding pathway and the difference in unfolding times were seen in the simulations at all the three high temperatures.

High temperature was used as a means for speeding up the unfolding so the simulations could be completed. However, the high temperature may alter the folding/unfolding pathway. As already noted, temperature affects the strength of electrostatic interactions. Likewise it can affect hydrophobic interactions (77). Nonetheless comparison against experimental results and other theoretical approaches continues to suggest that high temperature unfolding simulation is a useful means for elucidating the unfolding process.

# Native architecture as a determinant of unfolding pathway

The two homologous cold shock proteins have very different unfolding rates and yet appear to share a common unfolding pathway in the MD simulations. A simplistic interpretation of the common pathway is that unfolding appears to follow a least-resistance path. The path is dictated by the energetics of the native architecture, i.e., the arrangement of secondary structural elements in the folded structure. The structure of the cold shock proteins is a  $\beta$ -barrel with a long flexible loop separating the N-terminal  $\beta$ -sheet from the C-terminal  $\beta$ -sheet. The first question faced by the protein under unfolding pressure is which  $\beta$ -sheet to melt first. Apparently the C-terminal sheet, with one less  $\beta$ -strand, is the loser. Within the C-terminal  $\beta$ -sheet, the next question is which of the two strands is melted first.  $\beta$ 4, likely helped by backbone hydrogen bonds with  $\beta$ 1, wins out. After the C-terminal  $\beta$ -sheet is melted, the question faced by the still intact N-terminal  $\beta$ -sheet is which of the three strands is melted first. Here  $\beta$ 3 loses out as the other two strands are stabilized



FIGURE 10 Mean square  $C_{\alpha}$ - $C_{\alpha}$  distance versus the sequence separation, calculated over the unfolded portion (35.000–50.699 ns) of the MD trajectory of Bc-Csp at 500 K.

by a tight turn. In short, native interactions give rise to freeenergy barriers to melting. Each time the part of the remaining structure experiencing the least resistance, i.e., with the lowest free-energy barrier, is melted first. Based on the argument of microscopic reversibility, the last remaining secondary structures can then be proposed to be part of the transition state for folding.

This least-resistance path model, suggested by the MD simulations of the two cold shock proteins and in apparent agreement with experimental  $\Phi$ -values, also appears to be supported by the transition states of a number of other  $\beta$ -proteins. Like the cold shock proteins, the SH3 domain also consists of two orthogonally packed  $\beta$ -sheets, one with two terminal strands ( $\beta$ 1 and  $\beta$ 5) and the other with the three central strands ( $\beta 2$ – $\beta 4$ ). A tight turn (called the distal loop) connects  $\beta$ 3 and  $\beta$ 4.  $\alpha$ -spectrin SH3 and src SH3 have only 33% of sequence identity, but their transition states obtained from  $\Phi$ -values are remarkably similar: the two-stranded  $\beta$ -sheet is unstructured, but the distal  $\beta$ -hairpin (strands  $\beta$ 3) and  $\beta$ 4 connected by the distal loop) is formed. This mirrors the situation of the cold shock proteins, where the  $\beta$ -hairpin within the three-strand  $\beta$ -sheet is formed by  $\beta 1$  and  $\beta 2$ . The transition state of SH3 domains has been largely reproduced in high-temperature MD simulations (44,47,49).

The Sso7d protein also consists of two orthogonally packed  $\beta$ -sheets, one with the first two strands ( $\beta$ 1 and  $\beta$ 2) and the other with the last three strands ( $\beta$ 3- $\beta$ 5), plus a C-terminal  $\alpha$ -helix.  $\beta$ 3 and  $\beta$ 4 are connected by a tight turn and packed against the  $\alpha$ -helix. To construct the least-resistance path, one may argue that the two-stranded N-terminal  $\beta$ -sheet will be melted before the three-stranded C-terminal  $\beta$ -sheet, and within the C-terminal  $\beta$ -sheet,  $\beta$ 5 will be melted before the  $\beta$ -hairpin formed by  $\beta$ 3 and  $\beta$ 4, which are stabilized by the tight turn between them as well as the packing against the  $\alpha$ -helix. The remaining secondary structures are then the

 $\beta$ -hairpin and the  $\alpha$ -helix, which are indeed found to be formed in the transition state (56).

In these illustrations of the least-resistance path model,  $\beta$ -hairpins, specifically those stabilized by a tight turn, play a prominent role. This role has also been highlighted in the folding of other  $\beta$ -proteins (51,57–60). The least-resistance path model is similar in spirit to the method of low entropy loss routes proposed by Weikl and Dill (78), which is applied to folding instead of unfolding (more on the Weikl-Dill method later). Despite a multitude of potential routes for folding or unfolding, the protein molecule may follow only a few dominant routes with low free-energy barriers (78,79).

# Polarized transition state of the cold shock proteins

There is no simple strategy for specifying the transition-state ensemble along an unfolding trajectory. We have argued that the earliest disrupted structural elements are absent in the transition state whereas the latest intact structural elements are a part of the transition state. For the cold shock proteins, the former consists of the C-terminal strands  $\beta 4$  and  $\beta 5$  and the latter consists of the N-terminal  $\beta$ -hairpin formed by strands  $\beta 1$  and  $\beta 2$ . The absence of the former and presence of the latter result in a polarized transition state, just as shown by  $\Phi$ -values.

The unfolding pathway observed in the MD simulations of the two cold shock proteins appears to be corroborated by native state hydrogen exchange studies on the homologous Escherichia coli cold shock protein A (Ec-CspA). Jaravine et al. (18) found that  $\beta 5$  is the least protected from hydrogen exchange among the five  $\beta$ -strands, suggesting that it encounters "a low free energy barrier to segmental unfolding". In the MD simulations, melting indeed started from  $\beta 5$ . Rodriguez et al. (26) observed relatively lower opening rates and relatively higher closing rates for residues located on  $\beta 2$ and  $\beta$  (but not  $\beta$ 1), suggesting that these two strands fold first (and unfold last). This conclusion is only in partial agreement with the MD simulations. Correlation between transition-state structure and protection from native-state hydrogen exchange has been reported for other proteins, but not without exception (80).

It is of interest to compare the transition state deduced from the unfolding simulations of the cold shock proteins to other theoretical predictions. The conservatism method of Mirny et al. (81) identified V-6, I-18, V-47, and V-63, which are located on  $\beta 1$ ,  $\beta 2$ ,  $\beta 4$ , and  $\beta 5$ , respectively. The first two residues are thus consistent with our simulation results, but the last two are contradictory.

Alm et al. (82) developed a simplified model for protein configurations, in which each residue is either ordered or disordered and at most two contiguous stretches of ordered residues can exist. The free energy of each configuration is based on native interactions, and the transition state is identified as the highest energy state along the lowest energy path from the unfolded state to the folded state. This method predicts high  $\Phi$ -values for V-6–V-28 (located on  $\beta$ 1- $\beta$ 2) for Bs-CspB (their prediction is available at http://tools.bakerlab.org/~predictions/cgi-bin/test.cgi), which are in full agreement with our simulation results. In this context we note that other simple models have also been developed to predict  $\Phi$ -values (83–85).

The method of low entropy loss routes of Weikl and Dill (78) predicted two parallel routes for folding Bs-CspB. One leads to the formation of the  $\beta$ 1- $\beta$ 4 contact cluster by first forming the turn between  $\beta$ 1 and  $\beta$ 2, or the  $\beta$ 1- $\beta$ 2 or  $\beta$ 2- $\beta$ 3 contact. The other leads to the formation of the  $\beta$ 3- $\beta$ 5 contact cluster by first forming the  $\beta$ 1- $\beta$ 2 turn, or the  $\beta$ 3- $\beta$ 4 loop, or the  $\beta$ 4- $\beta$ 5 contact. In reverse order, the first folding route bears resemblance to our unfolding simulations; our simulations did not show evidence for their second folding route. Their method is based on clustering native contacts according to secondary structural elements, much like our monitoring of the unfolding process by the fractions of intact secondary structures. Weikl and Dill predicted similar folding routes for Bs-CspB, Bc-Csp, and Ec-CspA.

Morra et al. (30), based on MD simulations biased toward unfolding, concluded that the two-stranded C-terminal  $\beta$ -sheet of Bc-Csp "forms the most stable substructure, which decomposes very late in the unfolding process". This is just the opposite of what was found in our unfolding simulations. Possible reasons for the discrepancy include the biasing potential, which could significantly distort the free-energy landscape, and the use of implicit rather than explicit solvent in their study. MD simulations of a number of proteins with both implicit and explicit solvent have uncovered the limitations of the implicit solvent model (86–88).

Karanicolas and Brooks (89) used both a simplified model similar to that developed by Alm et al. (82) and a protein model consisting of a string of beads to study the folding mechanism of Ec-CspA. Like Alm et al., the simplified model predicted that the three-stranded N-terminal  $\beta$ -sheet forms first, followed by the attachment of  $\beta$ 4 and finally  $\beta$ 5. This is just the reverse order of our unfolding simulations. On the other hand, the bead model predicted that the two  $\beta$ -sheets form independently, and then coalesce to form the folded structure.

A number of simpler models as well as our explicit water simulations are thus all able to correctly predict the polarized transition state of cold shock proteins. It appears that there is robustness in the transition state, which allows the methods to transcend their limitations.

#### Ion pairs as modulators of unfolding rate

Despite the common unfolding pathway, the unfolding rates of Bc-Csp and Bs-CspB differ by 20 times (10,22). In the simulations Bc-Csp indeed unfolded more slowly, and we suggest ion pairs around Arg-3 as a major factor. To uncover the origin of the difference in folding stability between Bc-Csp and Bs-CspB, Perl and Schmid (20) have examined the effects of the 11 amino acid substitutions between the two proteins individually and in combination and found that the stability difference can largely be accounted for by charge substitutions at three positions: 3, 46, and 66. The effects of the substitutions were quantitatively explained by electrostatic calculations (29). Perl et al. (22) have also studied the effects of the 11 substitutions on the folding and unfolding rates  $k_f$  and  $k_u$ , and here again the differences seem to be concentrated on the three positions.

Our MD simulations of the two proteins elucidated the net effects of the 11 substitutions together on the unfolding process. As it is too costly to simulate all the 11 single mutants, we will now try to use the simulation results for the two proteins to rationalize experimental observations for the effects of charge substitutions at positions 3, 46, and 66 on  $k_{\rm f}$  and  $k_{\rm u}$ . Upon substitution a residue with native interactions in the transition state will have much stronger effect on  $k_{\rm f}$  than on  $k_{\rm u}$  (equivalent to a  $\Phi \sim 1$ ). Perl et al. (22) found Arg-3  $\rightarrow$  Glu to be such a substitution, decreasing  $k_{\rm f}$  of Bc-Csp by 18-fold but increasing  $k_u$  by just 2.6-fold. This result can be explained by the location of Arg-3 on the intact  $\beta$ 1- $\beta$ 2 hairpin in the transition state and the ion pairs formed by Arg-3 with, e.g., Glu-21 and Glu-46. In the Arg- $3 \rightarrow$  Glu mutant, the Glu-3 residue will experience charge-charge repulsion with Glu-21 and Glu-46 in the transition state, thus raising its free energy and decreasing  $k_{\rm f}$ . In the folded state of the mutant, the repulsion with Glu-21 and Glu-46 will likely be stronger, and there is also additional repulsion with the C-terminal. The Arg- $3 \rightarrow$  Glu substitution thus raises the free energy of the folded state more than that of the transition state, hence increasing  $k_{\rm m}$ .

The substitution of a residue without native interactions in the transition state will have a much stronger effect on  $k_u$ than on  $k_f$  (equivalent to a  $\Phi \sim 0$ ). Leu-66  $\rightarrow$  Glu was found by Perl et al. (22) to be such a substitution, increasing  $k_u$  of Bc-Csp by 4.3-fold but decreasing  $k_f$  by just 1.4-fold. This result can be explained by the location of Leu-66 on the melted  $\beta$ 5 strand in the transition state. In the Leu-66  $\rightarrow$  Glu mutant, the Glu-66 residue will experience charge-charge repulsion with Glu-21 and Glu-46 in the folded state. Such repulsion is much diminished in the transition state since Glu-66 along with the C-terminal is free to move away. Consequently the free-energy barrier for unfolding is lowered, resulting in an increase in  $k_u$ .

Perl et al. (22) found the Glu-46  $\rightarrow$  Ala substitution to decrease both  $k_{\rm f}$  and  $k_{\rm u}$  (by 43% and 17%, respectively), leading to an "abnormal"  $\Phi$ -value of 1.5. The decrease in  $k_{\rm f}$ can be understood by the presence of the Arg-3-Glu-46 ion pair in the transition state. The favorable interaction is eliminated by the Glu-46  $\rightarrow$  Ala substitution, raising the freeenergy barrier for folding and decreasing  $k_{\rm f}$ . In the folded state, Glu-46 experiences repulsion with the C-terminal, which is diminished in the transition state. The Glu-46  $\rightarrow$  Ala substitution eliminates the repulsion in the folded state, leading to a higher free-energy barrier for unfolding and a  $k_u$ .

The dominant role of the substitutions at positions 3, 46, and 66 in accounting for the difference in folding and unfolding rates between Bc-Csp and Bs-CspB is demonstrated by the experimental result that the triple substitution Arg-3  $\rightarrow$  Glu/Glu-46  $\rightarrow$  Ala/Leu-66  $\rightarrow$  Glu on Bc-Csp lowers the folding rate by 24-fold and raises the unfolding rate by 15-fold, largely closing the gap between the two proteins. Similarly, the double substitution Glu-3  $\rightarrow$  Arg/Glu-66  $\rightarrow$  Leu on Bs-CspB leads to folding and unfolding rates very close to those of Bc-Csp. As revealed in our MD simulations, longrange electrostatic interactions among the charged residues can significantly modulate the rate of unfolding.

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