# Backbone Relaxation Coupled to the Ionization of Internal Groups in Proteins: A Self-Guided Langevin Dynamics Study

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ABSTRACT Pathways of structural relaxation triggered by ionization of internal groups in staphylococcal nuclease (SNase) were studied through multiple self-guided Langevin dynamics (SGLD) simulations. Circular dichroism, steady-state Trp fluorescence, and nuclear magnetic resonance spectroscopy have shown previously that variants of SNase with internal Glu, Asp, and Lys at positions 66 or 92, and Arg at position 66, exhibit local reorganization or global unfolding when the internal ionizable group is charged. Except for Arg-66, these internal ionizable groups have unusual pK<sub>a</sub> values and are neutral at physiological pH. The structural trends observed in the simulations are in general agreement with experimental observations. The I92D variant, which unfolds globally upon ionization of Asp-92, in simulations often exhibits extensive hydration of the protein core, and sometimes also significant perturbations of the  $\beta$ -barrel. In the crystal structure of the V66R variant, the  $\beta$ 1 strand from the  $\beta$ -barrel is domainswapped; in the simulations, the  $\beta$ 1 strand is sometimes partially released. The V66K variant, which in solutions shows reorganization of six residues at the C-terminus of helix  $\alpha$ 1 and perturbations in the  $\beta$ -barrel structure, exhibits fraying of three residues of helix  $\alpha 1$  in one simulation, and perturbations and partial unfolding of three  $\beta$ -strands in a few other simulations. In sharp contrast, very small structural changes were observed in simulations of the wild-type protein. The simulations indicate that charging of internal groups frequently triggers penetration of water into the protein interior. The pK<sub>a</sub> values of Asp-92 and Arg-66 calculated with continuum methods on SGLD-relaxed structures reached the normal values in most simulations. Detailed analysis of accuracy and performance of SGLD demonstrates that SGLD outperforms LD in sampling of alternative protein conformations without loss of the accuracy and level of detail characteristic of regular LD.

## INTRODUCTION

Ionizable groups buried in the interior of proteins play essential functional roles in bioenergetics, including catalysis,  $H^+$  transport, and  $e^-$  transfer reactions. The ionization of internal group is often coupled to structural relaxation. A drastic example is represented by the photoactive yellow protein, in which ionization of an internal group triggers structural reorganization that exposes up to 23% of the buried backbone amide groups to solvent. This effectively transforms the protein into a molten globule (1–3). In bacteriorhodopsin, a cascade of conformational changes triggered by a charge separation event drives the pumping of a  $H^+$  from the cytoplasmic to the extracellular side of the purple membrane (4–6). In ATPase, protonation of Asp-61 triggers structural changes that lead to  $H^+$  translocation by the *c* subunit (7,8).

Structural relaxation coupled to the ionization of internal groups has been studied by x-ray crystallography, nuclear magnetic resonance (NMR), Fourier transform infrared, and single molecule spectroscopy, hydrogen exchange, etc. Despite the wealth of structural detail that such experiments provide, they do not contribute detailed understanding of the mechanism and pathways of conformational reorganization at the atomic level. Computational methods, when bench-

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marked against experiments, offer the possibility of obtaining microscopic level descriptions necessary for understanding the structural basis of function governed by the ionization of internal groups.

Computational modeling of conformational rearrangements triggered by the ionization of internal groups is challenging. Standard molecular dynamics (MD) simulations in which protonation states of ionizable groups are fixed fail to reproduce protonation and deprotonation of ionizable groups; these processes are coupled to the properties of the local environment, which may change during the simulations. Constant pH MD simulations, in which the charged state of ionizable groups is allowed to vary, are being developed to circumvent these problems (9–17).

Conformational rearrangements triggered by ionization of internal groups may occur on a variety of timescales, as demonstrated in bacteriorhodopsin (6). Although MD simulations can describe processes at timescales of ns and faster, they fail to sample conformations that arise through processes at timescales of  $\mu$ s and longer. New computational and theoretical methods with improved abilities for conformational search are the focus of intense research. Emerging methodologies are based on different algorithms, e.g., coarsegraining (18–22), smoothing protocols (23–26), generalized ensembles (27,28), optimization of actions (29), or additions of constraints or forces (30–32). The ability of these methods to reproduce ligand-driven conformational transitions needs to be tested.

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Variants of staphylococcal nuclease (SNase) with internal ionizable groups are useful benchmarks for computational methodologies. Because the protein is not as polarizable as water, these groups usually titrate with pK<sub>a</sub> values shifted in the direction that promotes the neutral state (depressed for basic groups and elevated for acidic ones (33,34)). In most variants, the internal ionizable groups are neutral at physiological pH. Crystal structures and circular dichroism, steadystate fluorescence, and NMR spectroscopies show that the response of the proteins to the ionization of internal groups depends strongly on the nature of the group and on its location inside the protein. In principle, electronic polarization, relaxation of dipoles from backbone and side chains, and water penetration can all be a part of the protein's response to the ionization of the internal groups. In certain cases, dielectric breakdown (i.e., local or global changes in the protein secondary and tertiary structure) may occur.

If the dielectric response involves small structural changes, standard computational methods should easily reproduce them. For example, in the L38K variant of SNase the experimental pK<sub>a</sub> value of Lys-38 was reproduced with Poisson-Boltzmann calculations on structures relaxed through simple energy minimization and short MD runs using a relatively low dielectric constant of 4 to account for electronic polarizability and minor structural relaxation (35). In contrast, a dielectric constant of 10 was needed to reproduce the pKa value of 5.7 of Lys-66 (36). The high dielectric constant needed in the continuum calculations to reproduce the experimental pKa value suggests that other mechanisms of dielectric response occur when Lys-66 is ionized, which were not treated explicitly in the Poisson-Boltzmann calculations. MD simulations of the V66K variant with Lys-66 in charged form (37) have indicated that Lys-66 side chain may twist, exit the protein interior, and become hydrated by the bulk water, suggesting that in this case, rearrangement of the side chain may be the dominant mechanism of dielectric relaxation. In another study, conformational changes in the related V66E variant were studied through a new method in which the charge assigned to an internal group is increased beyond its physical value (38). With the increased charge, side-chain twisting and hydration were achieved, and the correct pKa value shift for Glu-66 was reproduced while using a low dielectric constant.

Recent NMR studies have shown that structural changes coupled to the pH-induced ionization of Lys-66 in SNase are more complex than simple side-chain twisting (M. S. Chimenti and B. García-Moreno E., 2008, personal communication). These studies show that several residues of the  $\beta$ -barrel experience changes in proton chemical shifts, consistent with local structural reorganization. Six residues at the C-terminus of helix  $\alpha$ -1 experience additionally line broadening, which is suggestive of a structural reorganization on a microsecond or longer timescale. In contrast, crystallographic studies of the variant with an Arg in position 66 show domain swapping of strand  $\beta$ 1 (D. A. Karp and B. García-Moreno E., 2008, personal communication). The pH-induced ionization of internal group at another interior location, position 92, unfolds the protein globally (39). Owing to the extreme sensitivity of the observed conformational changes to the nature and location of inserted charges, these proteins are an excellent model system for studying the interplay between electrostatic interactions, local geometry, protein flexibility, and hydration in determining the nature of structural relaxation processes in response to the binding/release of a ligand (i.e.,  $H^+$ ).

To gain insight into pathways of pH-induced conformational rearrangements observed experimentally in variants of SNase (global unfolding in the I92D variant, and local structural rearrangements in V66K and V66R variants), we used the self-guided Langevin dynamics (SGLD) method (32). No well-established computational method has described conformational rearrangements in a protein of this size and complexity, while maintaining the same level of detail (all atom and explicit solvent simulations) necessary for understanding transition pathways. SGLD increases searching efficiency by enhancing systematic conformational changes. The earlier version of this method, self-guided molecular dynamics (40) was based on a local average of nonbonded forces to guide systematic motions of a simulated system. It was found that the guiding forces calculated from nonbonded forces bias low energy conformations. In addition, in stochastic dynamics simulations, this kind of guiding force is often overwhelmed by random force noise and provides little guiding effect. To overcome these drawbacks, momentum-based guiding forces are used in the newly developed momentum-enhanced hybrid Monte Carlo (41) and in SGLD (32). In these methods, three parameters are used to control the guiding effect. One is the local averaging time, which defines the slow motions that are to be enhanced. A second is the guiding factor, which controls the strength of enhancement. The third is the friction coefficient that is used. The optimal choice of friction is typically an orderof-magnitude or two weaker than friction involving solvent. Weak friction is used to enhance conformational transitions rather than to mimic the effect of the solvent. Because of the guiding component of these simulations, information about the timescales of protein dynamics is lost. SGLD has been tested extensively in peptide folding simulations and other small systems, and has been shown to keep the density of states unaltered with reasonable choice of guiding parameters, while enhancing the conformational search ability (32).

#### METHODS

#### Simulated proteins and system setup

Four variants of SNase were simulated:

1.  $\Delta$ +PHS, a hyperstable variant of SNase that differs from the wild-type in five substitutions (G50F, V51N, P117G, H124L, S128A) and a 44– 49 deletion (39). Since this variant does not contain ionizable groups in the hydrophobic core of the protein, it will be referred to as the wildtype or background protein.

- Δ+PHS/V66K, referred to as V66K. The pK<sub>a</sub> value of Lys-66 is 5.7 (33); therefore, Lys-66 is neutral at physiological pH. Studies with NMR spectroscopy suggest that the C-terminus of helix α1 becomes more dynamic upon pH-induced charging of Lys-66.
- Δ+PHS/V66R, referred to as V66R. At physiological pH, Arg-66 is charged. Crystallographic studies showed that the β1 strand domain swaps. In the process, the side chain of Arg-66 becomes exposed to water.
- Δ+PHS/I92D, referred to as I92D. Asp-92 has an apparent pK<sub>a</sub> value of 7.5. This protein undergoes global unfolding upon pH-induced charging of Asp-92.

The starting structure used for the simulations was the structure of the  $\Delta$ +PHS/V66K variant obtained with the internal Lys-66 in the neutral form (33). The starting structures for the other variants were derived from this structure by mutating residue 66 or 92 into the appropriate amino acid. The orientation of Asp-92 in I92D and the locations of two water molecules surrounding the Asp-92 residue were determined through alignment with the crystal structure of the I92E variant (42). For the system setup and subsequent MD and SGLD runs, the program CHARMM (43) was used. The CHARMM force field, version 27 was employed (44). Lys-66 and Arg-66 were positively charged, and Asp-92 was negatively charged. Briefly minimized protein was embedded in a water box. Water molecules within 2.5 Å of the protein or crystallographic water molecules were removed. The protein was centered at the coordinate origin, and all water molecules further than 36 Å from the origin were also removed. The total number of water molecules and ions for the simulated systems were: wild-type (WT) (5245 water molecules, 8 Na<sup>+</sup> ions, 14 Cl<sup>-</sup> ions), V66K (5237 water molecules, 8 Na<sup>+</sup> ions, 17 Cl<sup>-</sup> ions), V66R (5221 water molecules, 8 Na<sup>+</sup> ions, and 17 Cl<sup>-</sup> ions), I92D (5245 water molecules, 8 Na<sup>+</sup> ions, 13 Cl<sup>-</sup> ions). The systems were subjected to minimizations under rhombic dodecahedral symmetry.

Modeling of the pH-induced ionization of internal groups in this study was achieved by charging the groups. The abrupt change in the state of ionization of the internal ionizable groups is artificial. It is only meant as a device to probe the conformational changes that would be reflected in the ensemble in solution under conditions of pH where the ionizable groups are fully charged.

#### **MD and SGLD simulations**

The systems were first heated up in steps of 2 K, from 100 K until 300 K. Equilibration for 100 ps in an NPT ensemble followed. The extended system formalism was used to maintain constant pressure and temperature via the Hoover thermostat (45) with a thermostat coupling constant of 1000 kcal/mol/ps<sup>2</sup>, while the normal pressure was maintained with a barostat with a piston mass of 500 amu, and piston collision frequency of 20/ps (46). Rhombic dodecahedral periodic boundary conditions and particle mesh Ewald method (47) for electrostatic interactions were employed, with the following parameters for Ewald simulations:  $\kappa = 0.45$ , interpolation order of 6, grid spacing of ~1 Å, and real-space interaction cutoff of 10 Å. Lennard-Jones interactions were shifted to zero after 10 Å. The leapfrog Verlet algorithm was used with a timestep of 1 fs. For each of the four protein systems five different heating and equilibration runs were initiated, with five different seed numbers for the random number generator used for assigning initial velocities.

SGLD simulations (32) were performed for each of the completed equilibration runs. The equation of motion for the SGLD dynamics of an N particle system is

$$\vec{p} = \vec{f}_{i} - \gamma_{i} \vec{p}_{i} + \vec{R}_{i} + \lambda_{i} \gamma_{i} \langle \vec{p}_{i} \rangle_{L}, \qquad (1)$$

where  $\gamma_i$  is the collision frequency,  $\vec{R}_i$  is a random force, and  $\lambda_i$  is the guiding factor. Here *L* represents the number of timesteps over which the averaging is performed, while the averaging time is  $t_L = L \, \delta t$ , where  $\delta t$  is the timestep. The

same friction coefficient  $\gamma$  and guiding factor  $\lambda$  was used for all particles. The following guiding parameters were tested: A:  $t_{\rm L} = 0.1$  ps,  $\lambda = 0.0$ ; B:  $t_{\rm L} = 0.1$  ps,  $\lambda = 0.25$ ; C:  $t_{\rm L} = 0.1$  ps,  $\lambda = 1.0$ ; D:  $t_{\rm L} = 0.5$  ps,  $\lambda = 0.25$ ; and E:  $t_{\rm L} = 0.5$  ps,  $\lambda = 1.0$ .

SGLD runs were performed in an NVT ensemble at 300 K. The friction coefficient was  $\gamma = 1/\text{ps}$  for both Langevin dynamics ( $\lambda = 0.0$ ) and SGLD. Each SGLD simulation was run for 10 ns, for a total of 250 ns of simulation time for each of the four proteins.

#### Assignment of secondary structure

Automated identification of elements of secondary structure depends on the criteria used to catalog secondary structure. The criteria may include hydrogen-bond patterns (e.g., DSSP (48)), a combination of hydrogen-bond patterns and  $\Phi/\Psi$  angles (e.g., STRIDE (49)), or  $C_{\alpha}$  distances and  $\Phi/\Psi$  angles (e.g., KAKSI (50)). Because different methods use different criteria they often disagree, especially at the edges of helices and strands, which are of special interest in this study.

Secondary structure assignments were performed on snapshots from SGLD trajectories. Coordinates were recorded every 10 ps (a total of 25,000 snapshots were taken for each simulated system). For each coordinate set the secondary structure was assigned with DSSP and KAKSI. Secondary structure assignment was performed for residues that were characterized as belonging to an  $\alpha$ -helix or a  $\beta$ -strand in the crystal structure, and for a few residues around those residues. Remaining residues were assigned zero helical or strand character. Residues in  $\alpha$ -helices were labeled "H," and those in  $\beta$ -strands were labeled "E" in DSSP, or "b" in KAKSI.

# Identification of conformational changes and additional simulations

Changes in the conformation of each residue were identified by following the time evolution of secondary structure assignments through DSSP and KAKSI. To filter out small fluctuations in the secondary structure a stringent set of criteria were applied: 1), only changes that persisted longer than 100 ps were considered; 2), only changes that were registered through both DSSP and KAKSI were kept; and 3), the structures chosen had to be recorded as frayed when visually inspected with VMD (which uses STRIDE to assign secondary structure).

Because the observed structural changes were often small, additional SGLD runs were performed to enhance them. These additional runs were performed starting from structures that satisfied the above criteria. They were each 5 ns long, and were performed with the guiding factor 1.0 while the averaging times were varied from 0.1 to 0.5 in steps of 0.05. In the case of the I92D variant, the observed conformational changes were larger than for other variants. Thus, in this case, instead of amplifying only the chosen simulations, each of the 10-ns-long SGLD runs with nonzero guiding factors was extended for an additional 6 ns.

#### **Effective energies**

To examine whether observed conformational changes contribute to the energetic relaxation of the protein, the evolution of the protein's effective energies was recorded. The effective energy was calculated as the sum of the self-energy, equal to the potential energy of the protein, and the solvation free energy. The solvation free energy was estimated through the linear response method (51). Thus,

$$E_{\rm eff} = E_{\rm self} + \beta E_{\rm ele} + \alpha E_{\rm vdw} + \gamma SASA. \tag{2}$$

Here  $\alpha$ ,  $\beta$ , and  $\gamma$  are empirical parameters. The values employed were  $\alpha = 0.4$ ,  $\beta = 0.5$ , and  $\gamma = 0.0072$  kcal/mol/Å<sup>2</sup> (52).  $E_{\rm int}$  and  $E_{\rm vdw}$  are the electrostatic and van der Waals energies of interaction of the protein with water molecules and ions. All electrostatic and van der Waals energies were

shifted to zero beyond 10 Å. The last term in this equation accounts for the so-called cavitation term, and is proportional to the solvent-accessible surface area (SASA). SASA was calculated through the analytic method of Richmond (53). The atomic radii and parameters are those of Kyte and Doolittle (54). The probe radius was 1.4 Å. All energy terms are determined as averages over 1000 conformations recorded every picosecond of trajectory.

#### pK<sub>a</sub> calculations

Structural relaxation coupled to the ionization of internal ionizable groups should lead toward states in which the  $pK_a$  values of the internal groups are normal. As a measure of the completeness of structural relaxation, the  $pK_a$  values of internal ionizable groups were calculated with the finite difference Poisson-Boltzmann method in the UHBD package (55) on snapshots from SGLD simulations. Details of the finite difference Poisson-Boltzmann calculations with SNase have been described elsewhere (36).

If sampling were not a problem, MD calculations would be able to capture the effects of ionization-induced conformational relaxation of proteins. If this were the case, a low dielectric constant of 2 (to account for electronic polarizability) would be appropriate for the calculation of pKa values with continuum methods when the continuum calculations are coupled to MD simulations to sample conformational reorganization explicitly. Empirically it has been shown that the combination of MD simulations and continuum electrostatics calculations yield the most reasonable results when a protein dielectric constant of 4 is used (56). The nature of these calculations still remains approximate, not only in the choice and meaning of the protein dielectric constants used in the continuum methods, but also because of discrepancies in the treatment of electrostatics in the MD simulations and in the continuum electrostatic calculations. The calculation of pKa values in our study is only meant as a metric to assess the extent of structural rearrangement. This is a useful approach because the pKa values of the groups of interest are shifted by dehydration when they are in their buried positions, and this effect should diminish dramatically as the structure reorganizes and the ionizable group becomes hydrated (36).

 $pK_a$  values were determined on structures recorded every 100 ps along the trajectory, as well as for the final snapshots of 10-ns-long MD simulations. The Born energy, which accounts for the energetic penalty of removing the ionizable group from bulk solvent and placing it into the protein, is described along with the  $pK_a$  value.

#### **RESULTS AND DISCUSSION**

# Structural consequences of ionization: fraying of helices and strands

The secondary and tertiary structure of SNase and the location of the substituted ionizable groups in the initial structure is shown in Fig. 1. It has been shown experimentally that the ionization of Lys-66 triggers reorganization of the C terminus of helix  $\alpha 1$ , the ionization of Arg-66 leads to the release of strand  $\beta 1$ , and the ionization of Asp-92 triggers global unfolding (B. Cannon and B. García-Moreno E., 2008, personal communication). To quantify the extent of unfolding observed in the simulations, the percentages of total simulation time that protein residues spent in an  $\alpha$ -helical or a  $\beta$ -strand conformation were determined through DSSP and KAKSI calculations on snapshots recorded every 10 ps. The values, representing averages over the 25 10-ns SGLD runs, are shown in Fig. 2.

The I92D variant displays large changes in the secondary structure, especially in regions of strands  $\beta 1$ ,  $\beta 3$ ,  $\beta 4$ ,  $\beta 5$ , and



FIGURE 1 Crystal structure of SNase (60) and position of Lys-66 (*red*), Arg-66 (*green*), and Asp-92 (*blue*) side chains.

of helix  $\alpha 1$  (Fig. 2). To amplify these changes, simulations with a nonzero guiding force were extended for an additional 6 ns. Structures that illustrate the largest changes in secondary structure after 16 ns of simulation time are shown in Fig. 3.

The average secondary structures of WT, V66K, and V66R variants are almost overlapping, as indicated in Fig. 2. Changes observed in the helical and strand structure of the three proteins were very small and usually short-lived and reversible. Thus, the strategy to simply extend all simulations to enhance the probability of observation of structural changes may not be the most productive way of searching conformational space. Therefore, additional runs were started only for structures that showed significant deviation from the initial secondary structure. To identify such structures, the time dependence of assigned secondary structures was followed, and only changes that persisted for longer than 100 ps were selected for further studies. Table 1 lists the residues that exhibited such fraying and the simulations in which they occurred.

Table 1 lists a large number of fraying events. Owing to limited access to computational resources, only secondary structure changes that initiated near the site of substitution were amplified with further simulations. The simulations that recorded such changes are B4 in WT; E1 and E2 in V66K; and C5 and E2 in V66R. Since Lys-66 in the C2 simulation of V66K leaves the interior and is fully solvated by bulk water, this simulation was amplified even though no significant changes in secondary structure changes were observed.

Snapshots representative of the largest secondary structure changes observed in additional simulations are shown in Fig. 3. For the WT, only fraying of C-terminus of strand  $\beta$ 1 is observed. In the V66K variant strands  $\beta$ 1,  $\beta$ 2,  $\beta$ 3, and the C-terminus of helix  $\alpha$ 1, were frayed. For the V66R variant, both ends of the  $\beta$ 1 and  $\beta$ 2 strands were frayed. More detailed analysis of the types and pathways of observed secondary structure changes is given in Relaxation Pathways.

#### Consequences of ionization: water penetration

To study the state of hydration of charged internal groups, the number of water molecules within 6 Å of polar side-chain



FIGURE 2 Percentage of total simulation time that residues in WT (*black*), V66K (*red*), V66R (*green*), or I92D (*blue*) spent in an  $\alpha$ -helical or a  $\beta$ -strand conformation. Secondary structure was assigned with DSSP (*top graph*) and KAKSI (*middle graph*). Bottom graph shows average RMSD values for backbone atoms of each residue.

atoms was calculated. Averages over each nanosecond of every simulation are shown in Fig. 4.

The figure shows that internal ionizable groups become solvated by a large number of water molecules during the



FIGURE 3 Snapshots from SGLD simulations representative of observed secondary structure changes. The residues undergoing change in the secondary structure are shown in red. The substituted ionizable groups are shown in stick representation.

course of the simulations. In the case of the V66R variant, the side chain was hydrated by water in the bulk phase, whereas in the cases of V66K and I92D variants the ionizable groups remained internal in the majority of simulations. Simulations in which ionizable groups are neutral are available for both the V66K and I92D variants (57). These simulations showed that the Lys-66 side chain is dehydrated and the Asp-92 side chain is surrounded by approximately two water molecules, in full agreement with crystallographic observations. Upon charging of the internal ionizable groups the number of surrounding water molecules increases from 0 to  $\sim$ 3–8 in the case of Lys-66, and from 2 to 10–15 in the case of Asp-92. Evidently, charging of an internal group promotes water penetration. This is illustrated graphically by representative snapshots from the simulation of the I92D variant with neutral and charged Asp-92 (Fig. 4).

### **Relaxation pathways**

In all cases, the simulations suggest that the structural relaxation that is coupled to the ionization of internal groups can follow multiple pathways. The pathways involve both penetration of water into the protein interior as well as relaxation of protein backbone and side chains.

The initial response to the ionization of Lys-66 involves fast hydration of the side chain by water penetration. This was observed in all simulations. Between three and eight water molecules penetrate and hydrate the amino moiety of Lys-66, usually during the equilibration stage or during the first two nanoseconds (Fig. 4). Visual inspection of selected trajectories reveals that two major pathways are used for water penetration; a passage between  $\alpha 1$  and  $\beta 1$ , and a

 
 TABLE 1
 List of residues that fray and simulations in which these fraying events occur

Protein, end	Fraying events	Protein, end	Fraying events
WT, $\beta_{1N}$	9 (often), 9–10 (B1, E5), 9–11 (E2), 0, 12 (C2)	WT, $\beta_{4N}$	none
V66K Box	(E2), 9-12 (C2) 10 (B4)	V66K Box	none
V66R $\beta_{\rm IN}$	9 (B1) 9–11 (C1)	V66R $\beta_{4N}$	none
WT $\beta_{1N}$	17 (B4*)	WT $\beta_{4N}$	none
V66K Bio	$15_{17}$ (E1*)	V66K $\beta_{4C}$	none
V66R Bic	17 (C5* E2*)	V66R $\beta_{4C}$	none
WT Bay	22  (often)	WT $\beta_{\rm ev}$	87 (A1 C3)
$V66K B_{max}$	22 (often)	V66K Bay	88 (A4 B2 D4)
V66R, $\beta_{2N}$	22 (often)	V66R $\beta_{5N}$	88 (A3 B5 C1 C3)
WT $\beta_{2N}$	22 (often) 27 (often)	WT $\beta_{ro}$	none
V66K Bac	27 (often)	V66K Bro	94 (E2*)
V66R $\beta_{2C}$	27 (A4 A5	V66R $\beta_{50}$	94 (C5*)
, oon, p <sub>2</sub> c	B4, B5, C2,	, oon, p3c	)1(05)
	C3, D3, E5)		
WT, $\beta_{3N}$	none	WT, $\alpha_{2N}$	none
V66K, $\beta_{3N}$	none	V66K, $\alpha_{2N}$	none
V66R, $\beta_{3N}$	31–32 (B1)	V66R, $\alpha_{2N}$	none
WT, $\beta_{3C}$	36 (A4, A5, B3, D5, E2, E3, E5)	WT, $\alpha_{2C}$	106 (B3,C5)
V66K, $\beta_{3C}$	36 (often)	V66K, $\alpha_{2C}$	106 (A4)
V66R, $\beta_{3C}$	36 (often)	V66R, $\alpha_{2C}$	106 (C1)
WT, $\alpha_{1N}$	54 (C1, C4, D3, E3)	WT, $\alpha_{3N}$	119–121 (D3, E3), 120–121 (D1, E4), 122 (B4, E4)
V66K, $\alpha_{1N}$	54 (B5, C5, D4)	V66Κ, α <sub>3N</sub>	119–121 (E5), 120–121 (A1, B5, E2), 122 (D5)
V66R, $\alpha_{1N}$	54 (B3, C1, C2, C4, E2, E3, E4)	V66R, $\alpha_{3N}$	119–121 (B2, B4, B5, C1, D2, E1), 120–121 (C2)
WT, $\alpha_{1C}$	68 (often)	WT, $\alpha_{3C}$	135 (often)
V66K, $\alpha_{1C}$	68 (often)	V66K, α <sub>3C</sub>	135 (often)
V66R, $\alpha_{1C}$	68 (often)	V66R, $\alpha_{3C}$	135 (often)

If a residue frayed in >10 simulations "often" is stated. Simulations for which additional SGLD runs were performed are indicated with an asterisk. I92D variant is not listed because fraying occurred in a large number of simulations.

passage between  $\beta 2$  and  $\beta 3$ . Several secondary relaxation processes were observed: exiting of the Lys-66 side chain from the protein interior, disruption of the structures of  $\beta 1$ ,  $\beta 2$ , or  $\beta 3$  strands, separation of  $\beta 1$  and  $\beta 2$  strands from the remainder of the protein, or fraying of residues in the C-terminus of helix  $\alpha 1$ .

The initial relaxation in the V66R variant involves both hydration of the guanidium groups of Arg-66 and hydrogen bonding to the turn between  $\beta 1$  and  $\beta 2$ . Fig. 4 shows that the hydration of this group happens in timescales ranging from the equilibration time to up to four ns. The number of water molecules surrounding Arg-66 ranges between 2 and 23 during the first nanosecond and between 12 and 28 during the last nanosecond. Inspection of selected trajectories suggests that the side chain of Arg-66 samples different rotameric states and protein hydrogen-bonding partners. The latter involve residues belonging to the  $\beta 1$ - $\beta 2$  turn,  $\beta 1$  strand, and the  $\alpha 1$  helix. Backbone relaxation observed in the simulations of the V66R variant involve fraying of both ends of  $\beta 1$  and  $\beta 2$  strands.

In simulations of the I92D variant the number of water molecules in the neighborhood of the carboxylic moiety of Asp-92 increases more slowly than for the other two variants. As shown in Fig. 4, the average number of water molecule within the 6 Å radius of polar groups of Asp-92 is between 3 and 8 during the first nanosecond of simulation time, and between 12 and 15 during the 10th nanosecond. Through inspection of the snapshots taken at the end of the 10th nanosecond, two major relaxation pathways can be identified. In one, the Asp-92 side chain is hydrogen-bonded to the backbone of the strand  $\beta 5$  (in most cases it is the backbone of Tyr-81). This conformation is present in 10 out of 25 simulations. Approximately half of those simulations are accompanied by partial disruption of the  $\beta$ 5 strand, complete disruption of the  $\beta$ 4 strand, and absence of water molecules from the protein core. In the other half, water is present in the core. In the remaining 15 simulations, Asp-92 is hydrated in the interior of the protein. Water penetration occurs through multiple routes. Various levels of disruption of the  $\beta$ -barrel are registered, including complete disruption of strands  $\beta$ 3,  $\beta$ 4, or  $\beta$ 5, and partial disruption of strands  $\beta$ 1 and  $\beta$ 2. Partial fraying of C-terminus of  $\alpha 1$  is also registered.

#### Energetics

A detailed energetic analysis was performed for simulations that displayed the largest changes in secondary structure near the site of substitution (B4 for the WT, E1 and E2 for the V66K, C5 and E2 for the V66R, and D2 and C3 for the I92D). The analysis was performed for two additional simulations: A1 of the WT, which serves as a control since it does not have guiding nor internal ionizable groups, and C2 of the V66K, in which Lys-66 side chain leaves the protein interior. The number of water molecules that hydrate internal ionizable groups and the  $pK_a$  values of these groups were determined for the simulations selected for analysis. Fig. 5 illustrates the analysis performed for each of the selected simulations.

Analysis of the control case (A1 simulation with WT), indicated that in the absence of internal ionizable groups, the effective energies can drop by as much as 40 kcal/mol during the course of the simulation. Analysis of the B4 simulation with WT indicates a drop in energy of 30 kcal/mol. Inspection of the contributions of individual secondary structure elements to total protein energy indicates that in many cases rearrangements in the loop regions give rise to changes in energy that are >5 kcal/mol. In the B4 simulation of WT, the observed secondary structure change that was observed, consisting of the breaking of a hydrogen bond between  $\beta$ 1 and  $\beta$ 2, did not contribute significantly to the overall change in energy.

Analysis of selected trajectories of V66K, V66R, and I92D variants indicates that ionization of internal groups some-



FIGURE 4 (*Top*) Number of water molecules within a 6 Å radius of side-chain polar atoms of substituted ionizable groups, averaged over 1 ns. (*Graphs* from *top* to *bottom*) Lys-66, Arg-66, and Asp-92. Different colors represent different simulations. (*Bottom*) Snapshots from simulation of I92D variant when Asp-92 is neutral (*left*) and charged (*right*). Red spheres represent internal water molecules.

times contributes to an additional decrease in energy. For example, in the C2 simulation with V66K, the hydration of Lys-66 contributed to a decrease in energy of 12 kcal/mol. In simulations of the I92D variant, hydration of Asp-92 contributed to a 30 kcal/mol decrease in energy. Since the errors related to cutoffs used to calculate electrostatic energies and to the use of empirical coefficients in Eq. 2 are large, the analysis yielded only a qualitative understanding of the energetics of protein conformational changes.

#### Comparison of experiments and simulations

The simulations of the WT protein showed small frayings of various secondary structure elements (Table 1). Such local unfolding events are not the focus of this study since they are observed consistently in simulations of all variants, and are thus considered background fluctuations. To ensure that parts of the WT protein that were supposed to be folded did not unfold during the SGLD simulations, hydrogen protection factors were determined by calculating the average number (over all 25 SGLD runs) of water oxygen atoms within a 3 Å radius of the backbone NH atoms (58). The calculation suggested that the hydrogens that are well protected in the experiment (59) are also well protected during the simulations. Some of the hydrogens that show exchange in experiments are dehydrated in the simulations. This discrepancy is attributed to limited simulation time and the fact that the simulated protein differs slightly from the protein used in hydrogen exchange experiments.

Circular dichroism and steady-state fluorescence suggest that the I92D variant undergoes global unfolding upon charging of the substituted ionizable group, and that the V66K and V66R variants undergo local reorganization. The trends observed in the simulations are fully consistent with these experimental trends. Of the four proteins that were studied, the I92D variant displayed the largest change in secondary structure and the largest root mean-square deviation (RMSD) values (Fig. 2). Changes in the V66K and the



FIGURE 5 Energetic analysis of simulation D2 with the I92D variant. (From *top* to *bottom*) Total effective energy, self-energy, electrostatic interaction energy, number of solvent molecules around Asp-92, Born term, and  $pK_a$  value of Asp-92. All energies are in kcal/mol. All numbers represent averages over 1 ns of SGLD runs.

V66R variant were less dramatic. Their RMSD values are similar to each other and they are in between those of the WT and the I92D variant. Even though secondary structure assignments during SGLD trajectory in Fig. 2 cannot distinguish between the WT and the V66K and V66R variants, additional simulations indicate that the secondary structure of the WT protein is perturbed much less than the secondary structure of V66K and V66R. This is illustrated in snapshots from additional simulations shown in Fig. 3.

The observed changes in secondary structure and calculated RMSD values for V66K and V66R variants are similar. Both variants show significant perturbations in the strand  $\beta 1$ , and sometimes also strands  $\beta 2$  and  $\beta 3$ , as shown in Fig. 3. The perturbations in strand  $\beta 1$  are consistent with the crystal structure of the V66R variant, which shows domain swapping of this strand when Arg-66 is in the charged state. No simulations of the V66R variant showed perturbations in the C-terminus of helix  $\alpha 1$ , but in a simulation of the V66K variant fraying of three residues (up to residue 65) was observed. This is consistent with results from NMR spectroscopy studies with V66K, which show that six residues in the C-terminus of helix  $\alpha 1$  are rendered more dynamic by the ionization of Lys-66. NMR experiments suggest that these residues are in the intermediate exchange regime, which occurs on a µs-to-ms timescale (M. S. Chimenti and B. García-Moreno E., 2008, personal communication). These timescales are still orders-of-magnitude away from what can be achieved by multiple and enhanced SGLD simulations, thus it is not surprising that full fraying of the C-terminus of helix  $\alpha 1$  was not observed in the simulations. The pK<sub>a</sub> values calculated for 10-ns snapshots from SGLD runs suggest that after 10 ns, the protein has not fully relaxed in response to ionization of Lys-66, as only one of 25 calculated pKa values is 10.4 or larger. The calculated pK<sub>a</sub> values of Lys-66 have a mean value of 5.6 and a standard deviation of 2.2. The pK<sub>a</sub> values calculated on the last snapshots of additional runs indicate that certain conformational changes can lead to normalization of the Lys pK<sub>a</sub> value. These include: twisting of the Lys-66 side chain and its hydration by the bulk water; fraying of C-terminus of helix  $\alpha$ 1; and fraying of strands  $\beta$ 1,  $\beta$ 2, and  $\beta$ 3.

The pK<sub>a</sub> values of Arg-66, calculated for the last snapshots of V66R simulations, display a mean value of 12.3 and a standard deviation of 1.1. These pK<sub>a</sub> values are characteristic of a fully solvated Arg, which has a pK<sub>a</sub> value of 12. This indicates that the protein relaxation in response to ionization of Arg-66 might be complete. The perturbation in the structure of strand  $\beta$ 1, as well as the breaking of several hydrogen bonds between strands  $\beta$ 1 and  $\beta$ 2 that were observed in the simulations, might correspond to the solution structure of the V66R variant. Domain swapping of strand  $\beta$ 1, observed in the crystal structure, might be an artifact of crystallization. A number of other experiments indicate that in solution this protein is monomeric (D. A. Karp and B. García-Moreno E., 2008, personal communication).

In 20 of 25 simulations of the I92D variant the protein's core is fully hydrated. The  $pK_a$  values of Asp-92 approach the value of 4.0 expected from a fully solvated Asp; the  $pK_a$  values calculated for last snapshots of I92D simulations display a mean value of 5.5 and a standard deviation of 2.1.

#### Accuracy and performance of SGLD simulations

Comparison of the results obtained with different guiding factors yields an estimate of the accuracy and performance of SGLD simulations. Statistical analysis of secondary structure

content resulting from simulations with different guiding factors has been performed. Results for a representative simulation (i.e., V66R) and for a representative secondary structure element (i.e., helix 1) are shown in Table 2. The table lists the percentage of total simulation time that each residue was  $\alpha$ -helical. The table, however, does not contain information on how often particular residues frayed. The information about the frequency of occurrence of fraying events that last longer than 100 ps is in Table 1. This table shows that, for example, residue 68 of helix 1 frayed in more than 10 simulations while residue 54 frayed in seven simulations. When fraying events are sampled well (i.e., when they occur often and in many simulations), such as in case of residue 68 of helix 1, all guiding factors yield similar results. In cases when changes in secondary structure occur infrequently, such as for residue 54 of helix 1, there are differences in performances of different guiding factors. Results for other secondary structure elements and other simulated proteins (data not shown) yield the same conclusion.

Performance of guiding factors in sampling infrequent events that last longer than 100 ps can be inferred by counting fraying events from Table 1. The results, shown in Table 3, indicate that guiding parameters B ( $t_1 = 0.1, \lambda = 0.25$ ), C ( $t_1 = 0.1, \lambda = 1.0$ ), and E ( $t_1 = 0.5, \lambda = 1.0$ ) perform approximately two times better than guiding parameters D ( $t_1 = 0.5, \lambda = 0.25$ ), or A (regular LD simulations) in sampling infrequently occurring events. The trends that were observed in the performance of guiding parameters were expected as a large guiding factor  $\lambda$  yields a large guiding force, while a large averaging time yields a small guiding force.

TABLE 2 Percentage that residues 50–69, which include the  $\alpha_1$  helix, were helical in simulations with different guiding factors

V66R, helix $\alpha 1$							
Residue	Regular LD	$t_1 = 0.1,$ $\lambda = 0.25$	$t_1 = 0.5,$ $\lambda = 0.25$	$t_1 = 0.1,$ $\lambda = 1.0$	$t_1 = 0.5,$ $\lambda = 1.0$		
50	0	0	0	0	0		
51	0	<1	0	<1	<1		
52	0	<1	0	<1	<1		
53	0	<1	0	<1	<1		
54	0	<1	<1	17	18		
55	>99	>99	98	99	99		
56	>99	>99	99	>99	>99		
57	>99	100	100	>99	>99		
58	>99	100	100	>99	100		
59	100	100	>99	>99	>99		
60	100	100	100	>99	100		
61	100	100	100	100	100		
62	100	100	100	>99	100		
63	100	100	100	>99	100		
64	>99	100	>99	> 99	>99		
65	>99	>99	>99	>99	>99		
66	>99	>99	>99	99	>99		
67	98	95	98	94	98		
68	71	67	77	62	63		
69	0	0	0	0	0		

TABLE 3 Performance of different guiding factors in sampling infrequent fraying events

Parameters	# < 10	# < 4
Regular LD	9	4
$t_1 = 0.1, \lambda = 0.25$	18	10
$t_1 = 0.1, \lambda = 1.0$	21	9
$t_1 = 0.5, \lambda = 0.25$	9	5
$t_1 = 0.5, \lambda = 1.0$	19	10

Numbers in column labeled "# < 10" included all events listed in Table 2, i.e., events that occurred in <10 simulations; numbers in column labeled "# < 4" included only events that occurred in <4 simulations.

Despite the apparently small advantage in sampling of rare events achieved by addition of guiding forces, the largest fraying of the secondary structure in the vicinity of the substituted ionizable groups are registered in simulation with nonzero guiding force. This becomes apparent by counting fraying events for the C-termini of strands  $\beta 1$  and  $\beta 5$  in Table 1. This is expected since charging of a neutral residue perturbs the system away from its equilibrium, and drives the system toward a new equilibrium. SGLD enhances such motions and accelerates the conformational changes associated with these ionization events.

The average RMSD values of each residue obtained in simulations with different guiding factors were compared (data not shown). In regions of compact secondary structure where fluctuations are small, i.e.,  $\alpha$ -helices and  $\beta$ -strands, all guiding factors exhibited approximately the same RMSD values. The exception are the region of strands  $\beta 1$  and  $\beta 2$  of the V66K variant, where the guiding parameters C and E, which utilize  $\lambda = 1$ , yield slightly larger RMSD values. The same two guiding parameters sometimes yield large RMSD values in loop regions, where fluctuations are large. In terms of hydration of interior groups, all guiding parameters yield comparable results (data not shown).

### SUMMARY

Structural consequences of the ionization of internal groups in proteins were explored through multiple SGLD simulations. The structural changes that were observed include small rearrangements (such as side-chain rotations), small and large-scale water penetration, and loss of secondary structure. The structural trends observed in the simulations are fully consistent with the trends observed experimentally. The structural changes in the vicinity of sites 66 and 92 in the simulations of the WT are rather small. In contrast, the V66K, V66R, and I92D variants show noticeable structural changes in the vicinity of the internal ionizable group, suggesting that these changes are indeed a consequence of the substitutions and of the ionization of these internal groups.

The largest changes were observed for the I92D variant. For this variant, which is known to unfold globally upon ionization of Asp-92, all simulations recorded the disruption of the  $\beta$ -barrel. The extent of disruption ranged from pertur-

bations of a few residues in some simulations, to the complete unraveling of two  $\beta$ -strands. The two strands closest to the substitution site,  $\beta 4$  and  $\beta 5$ , unraveled most often. Fraying at the C-terminus of helix  $\alpha 1$  was observed in some simulations. Charging of the internal Asp-92 in the I92D variant promoted water penetration: the protein core became hydrated by a large number of water molecules in the majority of simulations. In contrast, Asp-92 was hydrated by only one or two water molecules in simulations in which Asp-92 is neutral (57).

In simulations of the V66K and V66R variants, structural changes on a smaller scale were observed, in agreement with experimental observations. In simulations of the V66R variant, changes in the structure of the  $\beta 1$  and  $\beta 2$  strands were recorded, with sometimes up to five hydrogen bonds broken between them. This is consistent with the x-ray structure of V66R in which the  $\beta 1$  strand is released and the domain swapped. In the simulations of the V66K variant, changes in the  $\beta 1$ ,  $\beta 2$ , and  $\beta 3$  strands are observed. In one simulation, fraying of helix  $\alpha 1$  was observed. Changes in the  $\beta$ -barrel structure and C-terminus of helix  $\alpha 1$  are both consistent with observations by NMR spectroscopy.

The pK<sub>a</sub> values calculated on the final 10-ns snapshots  $(12.3 \pm 1.1 \text{ for Arg-66} \text{ and } 5.5 \pm 2.1 \text{ for Asp-92})$  are close to the normal pK<sub>a</sub> values of 12 and 4 for Arg and Asp, respectively. In contrast, the pK<sub>a</sub> values of Lys-66 (5.6 ± 2.1) was still far away from the normal value of 10.4. The pK<sub>a</sub> values of Lys-66 reach the model compound pK<sub>a</sub> values only in a few cases: when the side chain of Lys-66 left the protein interior, when fraying of C-terminus of helix  $\alpha 1$  occurred, or when fraying of strands  $\beta 1$ ,  $\beta 2$ , and  $\beta 3$  occurred.

An assessment of the accuracy and performance of SGLD was performed by comparing results of multiple simulations with nonzero and zero guiding force (regular Langevin dynamics). Four different sets of guiding parameters were tested. Populations of conformations that were easily accessible through regular LD simulations were comparable for LD and SGLD with all guiding factors, suggesting that SGLD does not alter population distributions. In sampling of rare protein conformations some SGLD parameters, particularly those that employed a guiding factor  $\lambda = 1$ , performed twice as well as LD. For V66K and V66R variants, conformational rearrangements coupled to ionization of internal groups were observed exclusively in the SGLD simulations with nonzero guiding force. This suggests that, despite the evidence that for one of the variants the conformational sampling achieved with SGLD is still insufficient, SGLD represents a significant improvement over MD and LD in sampling of conformations induced by proton binding events.

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