

pH-Dependent Transient Conformational States Control Optical Properties in Cyan Fluorescent Protein

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Supporting Information

ABSTRACT: A recently engineered mutant of cyan fluorescent protein (WasCFP) that exhibits pH-dependent absorption suggests that its tryptophan-based chromophore switches between neutral (protonated) and charged (deprotonated) states depending on external pH. At pH 8.1, the latter gives rise to green fluorescence as opposed to the cyan color of emission that is characteristic for the neutral form at low pH. Given the high energy cost of deprotonating the tryptophan at the indole nitrogen, this behavior is puzzling, even if the stabilizing effect of the V61K mutation in proximity to the protonation/deprotonation site is considered. Because of its potential to open new avenues for the development of optical sensors and photoconvertible



fluorescent proteins, a mechanistic understanding of how the charged state in WasCFP can possibly be stabilized is thus important. Attributed to the dynamic nature of proteins, such understanding often requires knowledge of the various conformations adopted, including transiently populated conformational states. Transient conformational states triggered by pH are of emerging interest and have been shown to be important whenever ionizable groups interact with hydrophobic environments. Using a combination of the weighted-ensemble sampling method and explicit-solvent constant pH molecular dynamics (CPHMD^{MSJD}) simulations, we have identified a solvated transient state, characterized by a partially open β -barrel where the chromophore p K_a of 6.8 is shifted by over 20 units from that of the closed form (6.8 and 31.7, respectively). This state contributes a small population at low pH (12% at pH 6.1) but becomes dominant at mildly basic conditions, contributing as much as 53% at pH 8.1. This pH-dependent population shift between neutral (at pH 6.1) and charged (at pH 8.1) forms is thus responsible for the observed absorption behavior of WasCFP. Our findings demonstrate the conditions necessary to stabilize the charged state of the WasCFP chromophore (namely, local solvation at the deprotonation site and a partial flexibility of the protein β -barrel structure) and provide the first evidence that transient conformational states can control optical properties of fluorescent proteins.

INTRODUCTION

Expanding the palette of genetically encodable fluorescent proteins (FPs) with spectral properties that can be modulated by pH is a well-appreciated challenge because of their wide applicability as noninvasive pH sensors¹⁻⁵ and optical highlighters for super-resolution imaging of living cells.⁶⁻⁹ The majority of such proteins developed to date belong to the green fluorescent protein (GFP) family and owe their pH-sensitive optical behavior to a tyrosine-based chromophore that can interconvert between the neutral (protonated) and charged (deprotonated) states, depending on the hydrogen-bonding environment surrounding its phenolic group.⁷ Rational design of new pH-sensitive variants requires both (i) a fundamental understanding of how the proteins with tyrosine-based chromophores function at the atomic level as well as (ii) looking at FPs with chromophores other than tyrosine as potential candidates (e.g., tryptophan- or phenylalanine/ histidine-based chromophores, as in the case of cyan and blue fluorescent proteins). Although the second approach has been long overlooked, the first one has been quite successful, resulting in a number of useful pH sensors (e.g., pHluorins,^{3,5} phRed²) and optical highlighters (e.g., Kaede^{8,9}). The efforts in

this direction, however, have mostly been focused on targeting the residues in the vicinity of the chromophore that affect its spectral characteristics through electronic effects and largely neglected the importance of characterizing the conformational ensemble of the protein.⁷

In recent years, a large body of evidence has emerged that suggests that understanding the mechanisms underlying protein functions depends on our ability to characterize its dynamic ensemble.^{10–12} Because of the nature of conventional biophysical techniques that primarily probe the most stable protein conformers, our understanding has long been limited to the information regarding highly populated ground conformational states. However, such states often represent only one of the functional forms, and higher-energy physiologically relevant conformers can be transiently populated (~10% or less) when initiated by external stimuli such as substrate binding, pH changes, or thermal fluctuations.^{12,13} Although low-energy

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ground-state conformers residing at the bottom of the conformational energy landscape are normally separated by very small kinetic barriers and interconvert between one another within pico- to nanoseconds, the barriers between them and higher-energy structures are larger and associated with interconversion within micro- to milliseconds or longer. Recent advances in relaxation dispersion NMR spectroscopy^{11,14} and room-temperature X-ray crystallography¹⁵ have made the detection of such transient conformational states possible, demonstrating their ubiquitous role in enzyme catalysis,¹⁰ protein folding,^{13,14} and ligand binding.¹⁶ Transiently populated conformational states triggered by pH are of particular importance because pH regulates the biological activity of many proteins, and the role of pH-dependent transient states is an emerging discovery that has been recently reported to influence membrane fusion,¹⁷ folding pathways, and, more generally, the dynamics of buried ionizable groups.¹⁹

In this paper, we demonstrate that pH-dependent transient conformational states can tune the absorption profile of cyan fluorescent protein (CFP),²⁰ a blue-shifted variant of the green fluorescent protein (GFP) family used for multicolor labeling and fluorescence resonance energy transfer (FRET) applications, that to our knowledge is the first precedent of such a mechanism. In particular, we provide a theoretical explanation for the nonmonotonic pH-dependent absorption of a recently engineered CFP mutant (WasCFP, Figure 1A). Although the



Figure 1. (A) Structure of WasCFP showing C_{α} positions of mutated residues (V61K, D148G, Y151N, and L207Q). (B) Structure of Trp66-based WasCFP chromophore covalently bound to β -barrel at positions shown with dashed lines (Leu64 and Val68). (C) Deprotonation of CRF. CRF-H and CRF⁻ are neutral (protonated) and charged (deprotonated) forms of the synthetic chromophore, respectively.

vast majority of the pH-sensitive fluorescent proteins reported to date^{2,3,5} exhibit monotonic changes in optical signals (e.g., absorption, emission, and excitation), the WasCFP mutant does not conform to such a monotonic behavior. It reversibly interconverts between cyan- and green-emitting forms, with the latter form dominant at pH 8.1 (and 25 °C), above which the green signal drops.²¹ Part of this behavior has been attributed to the deprotonation of the tryptophan-based chromophore (Figure 1B) at mildly basic pH, which is accompanied by a 60 nm bathochromic shift in absorption.

Even though the observed effect is a highly unusual scenario because the pK_a of an analogous indole is high (16.2 in H₂O and 21.0 in DMSO), Sarkisyan et al.²¹ have shown that a synthetic CFP chromophore (hereon referred to as CRF), which is a truncated version of that in the protein, undergoes a

similar pH-dependent absorption redshift in both protic and aprotic solvents, and its pK_a is depressed to 12.4 as a result of the more efficient delocalization of the negative charge over the extended π system (Figure 1C).

The same shift has been observed in a wild type (WT) CFP variant, mCerulean, denatured in 5 M NaOH. In addition, analogous pH-dependent bathochromic shifts, attributed to deprotonation at phenolic oxygen, have been previously detected in various members of the GFP family with tyrosine-based chromophores (e.g., yellow, red, and green fluorescent proteins).²² In WasCFP, a key V61K substitution positions a Lys residue in close proximity to the indole nitrogen of the chromophore (Figure 1B), and this was proposed to stabilize its deprotonated state.

The pK_a of the WasCFP chromophore, however, could not be directly measured, and the atomic-level details of its pHdependent absorption remained unknown. Moreover, no explanation for the nonmonotonic optical properties of WasCFP, specifically the signal drop in the green fluorescent form above pH 8.1, has been proposed.

To elucidate the mechanism of the unusual pH-dependent spectral behavior of WasCFP, we probed it with a combination of two computational techniques: the weighted-ensemble sampling method,²³ using a novel hydration order parameter,²⁴ and explicit-solvent constant pH molecular dynamics (CPHMD^{MSAD})²⁵ simulations, which have been used successfully to interrogate the pH-dependent dynamics of several biological systems.^{19,26–28} Among our key findings is the existence of a low- pK_a (6.8) solvated state characterized by a partially open β -barrel, which in combination with a high-p K_a (31.7) closed conformation governs the pH-dependent properties of WasCFP. In particular, we have shown that even in the presence of the stabilizing V61K mutation, the free energy cost of deprotonating the chromophore is still high and does not allow for the existence of the charged state of WasCFP even at high pH. The protein has to adopt a partially open conformation, allowing a few water molecules to access the chromophore. This conformation is transiently populated at low pH but becomes dominant under mildly basic conditions. The pH-dependent shift between the closed and open form is thus responsible for the bathochromic shift observed experimentally for WasCFP.

RESULTS AND DISCUSSION

First, to determine the plausibility for WasCFP (hereon referred to as, simply, WAS) to exist in the charged deprotonated state, we modeled the absorption properties of CRF at the TDDFT//B3LYP/6-31+G* level, both in gas phase and in implicit solvent. As shown in Table 1, the vertical excitation energy of the lowest-energy transition (ground to first excited electronic state; $S_0 \rightarrow S_1$) for the neutral CRF is in good agreement with both experimental findings²¹ and previous

Table 1. TDDFT//B3LYP/6-31+G* Vertical Excitation Energies and Oscillator Strengths for the Lowest-Energy (S₀ \rightarrow S₁) Transition of CRF-H and CRF⁻

	λ_{\max} (comp.) (nm) ^a	λ^{a}_{max} (exp.) (nm) ^{<i>a</i>}	$f_{\rm S0 \rightarrow S1}$
neutral	$(391^{a})^{b}$	400	${0.7}^a \ (0.6)^b$
charged	$\frac{415^{a}}{(400)^{b}}$	460	0.9 ^{<i>a</i>,<i>b</i>}

^{*a*}In implicit solvent. ^{*b*}In the gas phase.

computations,^{29,30} and the direction of the bathochromic shift between the neutral and anionic form is qualitatively reproduced. We note that the latter is quantitatively underestimated as a result of well-known systematic errors produced by TDDFT methods for anions.^{29,31}

Nevertheless, the computed oscillator strengths support the qualitative picture and demonstrate that the $S_0 \rightarrow S_1$ transition for the charged form is stronger than that for the neutral one, making plausible the existence of a charged state in the CRF.

Next, we constructed a model compound (RES; denoting the model compound "residue"), which is an extended CFP chromophore consisting of the CRF moiety covalently bound to Leu64 and Val68 (Figures 1B and 2) to serve as a reference



Figure 2. Thermodynamic cycle that shows alchemical transformations considered in this study. Cyan- and yellow-colored side chains correspond to V61 and K61 in WTP and V61KP peptides, respectively. pK_a values computed from CPHMD^{MSJD} simulations are highly elevated in both WT and WAS and, thus, are not responsible for the observed pH-dependent absorption of WasCFP.

for our explicit-solvent CPHMD^{MS λD} simulations.²⁵ Using a model p K_a of 12.7 (calculated using thermodynamic integration based on the CRF), we initially computed the p K_a values of the model wild type and mutant peptides (WTP and V61KP, respectively), which consist of 10 residues including key position 61, before proceeding to the WT and mutant (WAS) proteins, all using a thermodynamic cycle depicted in Figure 2.

As shown in Figure 2, although an alchemical transformation of CRF to RES barely alters the pK_a of the titrating moiety, perturbation by the peptide and protein environment (WTP and WT) shifts its pK_a by 1.1 and 39.4 units, respectively. Such large pK_a shifts have been reported when ionizable groups are transferred into a hydrophobic environment,³² and this demonstrates the sensitivity of the chromophore pK_a to the extent of local solvation at the protonation site. In our case, the solvation is high in the peptide and low inside the hydrophobic β -barrel of WAS, which is not surprising considering that nature selected the cylindrical β -barrel for fluorescent proteins in order to prevent fluorescence quenching by either water or oxygen.⁷ Using the thermodynamic cycle in Figure 2 and the pK_a values computed using the CPHMD^{MSAD} method, we calculated that the positive charge of Lys61 introduced in close proximity to the indole group of RES stabilizes V61KP by 5.4 kcal/mol with respect to WTP and WAS and by 27.9 kcal/mol relative to WT. This cost is also solvation-dependent and leads to the downshift of the RES pK_a in the peptide by 4 units, while at the same time depressing the pK_a in the protein by 20.4. Even though our simulations clearly show that positive charge in the vicinity of the protonation site stabilizes the anionic form of RES, both neutral WT and charged WAS species are extremely stable, with pK_a s of 52.1 and 31.7, respectively, that are comparable to those of the so-called "super-bases" in a low dielectric environment.³³ Therefore, the deprotonation at the indole nitrogen does not happen in such closed-state conformations over the experimental pH range of 6–10, and the computed pK_a values do not account for the observed pH-dependent absorption properties of WAS.

Numerous studies of conformational plasticity of proteins, however, have demonstrated the importance of characterizing the dynamic ensemble of their states, including those that are only transiently populated. $^{10-13,16}$ Moreover, partially open, solvated pH-dependent transient states have been hypothesized to be of general importance in systems with buried ionizable groups.¹⁹ However, capturing the transition between ground and transient conformational states often requires simulation time scales currently not accessible to the version of CPHMD used in our work. Therefore, guided by the observation of a significantly diminished pK_a in a well-solvated peptide versus a "dry" high-p K_a closed conformation of the protein, we chose a hydration of the chromophore as our reaction coordinate and carried out a search for an alternative WAS conformation using the weighted-ensemble sampling method²³ that allows escape from deep local minima (high-probability regions) and provides enhanced sampling of low-probability transient states. Figure 3 shows a sampling of WAS configuration space along a hydration parameter (φ), which posits the existence of transiently populated states characterized by the partially open β -barrel and local solvation at the protonation site. The



Figure 3. (Upper left panel) Probability distribution of the hydration parameter of RES in the WAS protein shows transiently populated states with large hydration parameters. (Top right and bottom panels) Snapshots of the chromophore environment in four different conformations of WAS corresponding to hydration parameters $\varphi = 2$, 7, 12, and 15. Number of water molecules within 7 Å of nitrogen of the chromophore (3, 8, 15, and 17, respectively) and the corresponding p K_a values computed using CPHMD^{MS4D} simulations are shown for each conformation.

 pK_a values of the RES chromophore were subsequently computed for four representative WAS structures, extracted from the four regions in the histogram ($\varphi = 1.5-2.5$, 5.5-8.0, 12.0-13.0, and 14.5-15.0), and structural changes influencing its pK_a were analyzed.

We discovered that opening of the $\beta7-\beta10$ channel (up to 1.58 Å backbone RMSD with respect to the crystal structure of WT, Figure 3B) previously shown to be rather flexible in both WT CFP³⁴ and in the study of the oxygen-diffusion pathway in red fluorescent protein, mCherry,³⁵ facilitates local solvation (i.e., an increase in the number of water molecules within a 7 Å radius) at the indole nitrogen. Our calculations suggest that the pK_a of the chromophore can be as low as 6.8 for a structure with a high hydration parameter ($\varphi = 15$) that corresponds to as many as 17 water molecules within 7 Å of the indole nitrogen of the chromophore (Figure 3). On the basis of the structural data provided from our simulations, the residues on strands $\beta7$ and $\beta10$ undergo local unfolding into an unstructured loop. Notably, as illustrated in Figure 4, residues



Figure 4. Distances between C_{α} - C_{α} atoms of residues in β 7 and β 10 strands in the open state (dominant at pH 8.1) vs the closed state (dominant at pH 6.1).

145–149 of β 7 and 204–206 of β 10 lose their secondary structure (refer to Figure S4 for C_{α} – C_{α} distances between β 7 and β 10 for all four structures in Figure 3). We note that these structural changes can be monitored by examining the carbon (C_{α}) chemical shifts in these regions as one titrates WasCFP from pH 8 to 6. We predict that these shifts would report a change from a mixed fraction of open and closed conformational states at pH 8 to a predominantly closed conformational state at pH 6. It is also worth noting that the chromophore in the open state is still significantly more rigid than it is in solution (Figure S6).

Because WasCFP itself is a relatively recent construct, there is a lack of experimental data measuring its fluorescent properties as a function of its dynamics. However, parallels can be drawn between CFP and related green fluorescent protein (GFP), which despite differences in the chromophore does share significant sequence similarity and may have similar conformational properties. Interestingly, prior studies of the unfolding of GFP have revealed a stable fluorescent intermediate that retained considerable secondary and tertiary geometry with displaced β 7 and β 10 strands and access of the water molecules to the chromophore.³⁶ It has also been noted that chromophore formation in fluorescent proteins occurs in a partially structured intermediate state, although this structure had reduced fluorescence. These experimental observations for GFP suggest that partially open conformations of the protein, similar to the transient state we observed in our simulations,

can exist. In addition, in two companion papers, where the effect of pressure on the quenching of fluorescence was examined, Weber and co-workers³⁷ and Krylov and co-workers³⁸ reported that mCherry and mStrawberry are both highly fluorescent at standard pressure (0.1 MPa) even though their chromophores are partially solvated. In fact, the extent of local solvation in our open state is similar to what the authors' computations predict for ambient conditions. In the context of our findings, it raises the possibility that non-ground-state protein conformations may play a role in modulating spectral properties of fluorescent proteins.

Lastly, to explain the unusual pH-dependent absorption behavior of WAS, we constructed a model on the basis of the assumption that WAS interconverts between the hydrated transient (open) state that we identified and its original closed configuration. Previously, we developed a two-state model to explain the protonation equilibrium of SNase mutants with buried ionizable groups,¹⁹ which allows one to compute the fraction of open state (F^{open}) as a function of pH on the basis of the ratio of the open- and closed-state populations (R_{oc}) deduced from the simulations, represented as

$$F^{\text{open}} = R_{\text{oc}} / (R_{\text{oc}} + 1) \tag{1}$$

where
$$R_{oc} = \frac{[Open]}{[Closed]}$$

= $-\frac{(10^{-pK_{open}} + 10^{-pH})}{(10^{-pK_{closed}} + 10^{-pH})} \frac{(10^{-pK_{closed}} - 10^{-pK_{app}})}{(10^{-pK_{open}} - 10^{-pK_{app}})}$ (2)

This ratio (the derivation of eq 2 is in Section S4 of the Supporting Information) is calculated using the computed microscopic pK_a values of both forms (pK_{open} 6.8 and pK_{closed} 31.7), and the apparent pK_a value is estimated on the basis of available experimental data (pK_{app} 7.8, Section S4).

To test the validity of the model, we compared the computed F^{open} values with those that can be found directly from the experiments reported in reference 21. As a basis for our analysis, we used the pH-dependent absorption data for WasCFP recorded by Sarkisyan et al.²¹ at 25 °C (Figure S2a,b of the Supporting Information in ref 21). The spectrum presented in their work differs from a typical pH-dependent absorption profile one would expect for a mixture of conjugated acid and base, where one form is largely dominant at low pH and the other one dominates at high pH. In the case of WasCFP, the signal at 494 nm, corresponding to the charged (deprotonated) chromophore, grows with pH up to pH 8.1, but then its intensity decreases-as a result of titration of a nearby Lys61, as suggested by the authors of the paper. In addition, the signal of the protonated form consists of two peaks: a bonafide spectral feature of all cyan fluorescent proteins, the origin of which is still a subject of a great controversy.^{20,29} Although the authors do not mention any open states or fraction of the open states in their work and discuss the signals at 436 and 494 nm as arising from the protonated and deprotonated forms of the chromophore in the same protein conformation, our simulations suggest that the chromophore can only exist in its deprotonated form when the protein conformation is partially open, allowing a few water molecules access to the deprotonation site. Therefore, for the remainder of this study, we will use the terms deprotonated and open states interchangeably and express the fraction of the open state, F^{open} , using only the following information: (1) extinction

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coefficients at 436 and 494 nm ($\varepsilon_{436, HA}$ and $\varepsilon_{494, A}$.), (2) absorbance of the protonated (closed) form at the lowest pH, $Abs_{436, low pH}$ (neglecting a small absorption signal at 494 nm, and (3) absorbance of the deprotonated (open) form, Abs_{494} , that is the only variable in our final equation for $F^{\text{open}}(\text{eq 9})$ that changes with pH (all taken from the data in ref 21).

Derivation of Expression for F^{open} **from Experiment.** The concentrations of protonated (HA) and deprotonated (A⁻) forms can be written in terms of the absorbances of the protein chromophore at the appropriate wavelengths (436 and 494 nm, respectively) using the Beer's-Lambert law, represented as

$$Abs_{436} = \varepsilon_{436,\text{HA}} \times b \times C_{\text{HA}} \tag{3}$$

$$Abs_{494} = \varepsilon_{494,\bar{A}} \times b \times C_{\bar{A}}$$
⁽⁴⁾

The sum of those concentrations represents the total concentration of all species, which remains constant at any pH, and is represented by

$$C_{\rm HA} + C_{\rm A^-} = C_{\rm T} \tag{5}$$

At low pH, the protonated form dominates so that $C_{\text{HA}} = C_{\text{T.}}$. Similarly, at high pH there is predominantly deprotonated form, and $C_{\text{A}}^{-} = C_{\text{T.}}$. Knowing that, we can represent the absorbances at low pH and high pH as

$$Abs_{436,\text{low pH}} = \varepsilon_{436,\text{HA}} \times b \times C_{\text{T}}$$
(6)

$$Abs_{494,\text{high pH}} = \varepsilon_{494,\text{A}^-} \times b \times C_{\text{T}}$$
⁽⁷⁾

From eq 6, we obtain C_T by substitution of eq 6 into eq 7. The absorbance at high pH can then be represented as

$$Abs_{494,\text{high pH}} = \frac{\varepsilon_{494,A^{-}}}{\varepsilon_{436,\text{HA}}} \times Abs_{436,\text{low pH}}$$
(8)

By dividing eq 4 by eq 7, we obtain the fraction of the deprotonated state, which varies with pH and is represented as

$$F^{\text{open}} = \frac{C_{A^{-}}}{C_{T}} = \frac{Abs_{494}}{Abs_{494,\text{high pH}}} = \frac{Abs_{494} \times \varepsilon_{436,\text{HA}}}{Abs_{436,\text{low pH}} \times \varepsilon_{494,A^{-}}}$$
(9)

Both extinction coefficients are available from experiment: $\varepsilon_{436, HA} = 28\ 000\ M^{-1}\ cm^{-1}$ and $\varepsilon_{494, A^{-}} = 51\ 000\ M^{-1}\ cm^{-1}$ The value of absorbance of pure HA at low pH, $Abs_{436,low\ pH\nu}$

The value of absorbance of pure HA at low pH, $Abs_{436,\text{low pH}}$, remains the same across the entire pH range, and the only parameter that varies is the absorbance of the A⁻ form at 494 nm (Abs_{494}), which can be calculated directly from the intensity of the peak. Table 2 provides all the information necessary to estimate F^{open} at different pH using the data from the pH-dependent absorption spectrum at 25 °C recorded by Sarkisyan et al.²¹

Two-State Model: Experiment Versus Simulations. As shown in Figure 5B, our two-state model provides a moderate correlation with experimental F^{open} values up to pH 8.1. However, it does not fully describe the system at higher pH (Figure 5A), where Lys61 presumably deprotonates, as mentioned above. Therefore, we introduced a third state that accounts for a neutral Lys61 and partially reprotonated chromophore at high pH, whose pK_a is approximated by that in the V61KP peptide found from our simulations (which is also in agreement with the experimentally suggested value of 9.8).

Table 2. F^{open} Derived from Experimental Data in Reference 21



Figure 5. pH-dependent F^{open} computed using (A) two- and (C) three-state models. Correlations with F^{open} estimated from the pH-dependent absorption data are shown in (B) and (D), respectively.

рH

Exp. F^{open}

Three-State Model: Experiment Versus Simulations. The states in our three-state model are defined as follows: (i) [RES-H/Lys⁺]_{closed}, a closed state with neutral RES chromophore and protonated Lys61 (pK_{closed} 31.7), (ii) [RES/Lys⁺]_{open}, an open state with deprotonated chromophore and protonated Lys61 (pK_{open} 6.8), and (iii) [RES-H/Lys]_{open}, an open state with reprotonated chromophore (pK_{RES} 9.8) and deprotonated Lys, whose pK_a (pK_{Lys}) was calculated from additional CPHMD^{MSAD} simulations where both the chromophore and Lys61 were simultaneously titrating.

Because of the complexity of the thermodynamic treatment of three different conformations, two of which have residues with strongly coupled protonation states (that of the chromophore and that of the nearby Lys61), we simplified the treatment of the three-state system into an effective twostate system. In our analysis, this effective two-state system corresponds to the bottom two arms of the thermodynamic cycle depicted in Figure 6, where the open-state conformations are collectively represented by states ii and iii and where the protonation states of the chromophore and Lys61 are tightly coupled.

Using the microscopic pK_a calculated for states i and ii as well as the experimental apparent pK_{app} (7.8), we calculated that if the pK_a of the second state was shifted to 9.8 (the value representing state iii in the three-state model), then it would result in a shift of pK_{app} to 10.8. Thus, the pK_{app} changes from 7.8 to 10.8 depending on the identity of the second state, which is primarily determined by the protonation state of Lys61. In other words, we assumed that the protonation state of Lys61 is coupled to the protonation state of the chromophore, which is justified because it is the only titrating residue in its vicinity.



Figure 6. Schematic illustration of the three-state model. K_{prot} and K_{deprot} are equilibrium constants corresponding to the pH-independent conformational transitions between open and closed states.

Hence, we interpolated the shift in the pK_{app} and pK_{open} by accounting for the fraction of unprotonated Lys61. Thus, the corresponding pK_{app} and pK_{open} are expected to vary as a function of pH, and we can substitute these pH-dependent terms into eq 2 to derive a ratio of the open to closed states for the three-state model. This ratio is then approximated using a modified eq 2 for R_{ocr} represented as

$$R_{\rm oc} = -\frac{(10^{-pK_{\rm open}^{\rm pH}} + 10^{-\rm pH})(10^{-pK_{\rm closed}} - 10^{-pK_{\rm app}^{\rm pH}})}{(10^{-pK_{\rm closed}} + 10^{-\rm pH})(10^{-pK_{\rm open}^{\rm pH}} - 10^{-\rm pK_{\rm app}^{\rm pH}})}$$
(10)

where both pK^{pH}_{open} and pK^{pH}_{closed} are pH-dependent and differ from their corresponding values in the two-state model $(pK_{open} 6.8 \text{ and } pK_{closed} 31.7)$ by the delta term (Δ) , the delta term is used to interpolate the pK_a of the open conformation from state ii to state iii by accounting for the coupling between protonation states of the chromophore and Lys61.

$$pK_{\text{open}}^{\text{pH}} = pK_{\text{open}} + \Delta \tag{11}$$

$$pK_{\rm app}^{\rm pH} = pK_{\rm app} + \Delta \tag{12}$$

$$\Delta = (pK_{\text{RES}} - pK_{\text{open}}) \times \frac{1}{1 + 10^{-(pH - pK_{\text{Lys}})}}$$
(13)

As shown in Figure 5D, our three-state model not only improves the correlation with experimental observables (with $R^2 = 0.86$), but also captures both qualitatively and quantitatively the unusual bell-shaped pH-dependent absorption profile of WAS (Figure 5C). Thus, our results show that the open state, collectively represented by the two locally solvated configurations and a partially open β -barrel, is transiently populated and contributes a small fraction at low pH (up to 12% at pH 6.1). This state becomes dominant (as much as 53%) at mildly basic conditions (pH 8.1), and gives rise to a strong absorption at 494 nm (and thus, green fluorescence), which then titrates with a p K_a of 9.8 at higher pH values.

Lastly, our three-state model provides some useful insights into engineering pH-sensitive cyan fluorescent protein based on WasCFP. For example, to engineer a mutant that does not possess the residual cyan fluorescence at high pH, one may target the electrostatic environment in the vicinity of Lys61 in a manner to prevent its reprotonation at mildly basic conditions. Such a design would suppress the population of the third state in our three-state model and reduce the mechanism of the engineered mutant to two interconverting states. As a result, the fraction of the open state with pK_{open} 6.8 (that only reaches a maximum of 53% at pH 8.1 in the current WasCFP design) will increase.

CONCLUSIONS

We have applied a combination of the weighted-ensemble sampling method²³ with a novel hydration parameter and explicit-solvent constant pH molecular dynamics $(CPHMD^{MS\lambda D})^{25}$ to elucidate the origin of the unusual nonmonotonic pH-dependent absorption behavior of a recently engineered CFP mutant that features a pH-dependent shift between cyan and green fluorescent forms. In earlier experimental observations, this optical property was proposed to be controlled by the charged anionic state of its tryptophancontaining chromophore.²¹ Our calculations demonstrate that even in the presence of the stabilizing V61K mutation, the freeenergy cost of deprotonating the chromophore is still high and does not allow for the existence of the charged state of WasCFP even at basic pH. Instead, we propose the following explanation. The distribution between two transiently populated conformational states, which have pK_{a} values of 6.8 and 9.8 and are characterized by a partially open β -barrel with local solvation around the chromophore, relative to the ground-state crystallographic structure that has pK_a of 31.7, is able to fully recapitulate both qualitatively and quantitatively the unusual nonmonotonic pH-dependent properties of WasCFP. In this model, the open state is transiently populated at low pH but reaches a population of 53% under mildly basic conditions before losing its dominance and reverting to a transient state under highly basic conditions. Such mechanistic understanding may be used to further engineer the pH-sensitive fluorescent properties of WasCFP. Therefore, our work not only validates that tryptophan can be deprotonated in a biological system at mildly basic pH but also, more importantly, shows that pHdependent transient conformational states are functionally relevant and that they can tune the optical properties of fluorescent proteins. Such an outlook will have implications in the rational design of fluorescent proteins with pH-dependent optical properties.

MATERIALS AND METHODS

Calculating Absorption Properties. The geometries of the neutral (protonated) and charged (deprotonated) synthetic chromophore, referred to in this study as CRF, were first optimized both in gas phase and in implicit solvent of high polarity (water) using a polarizable continuum model (PCM)³⁹ at the B3LYP/6-31+G* level, which has previously been widely applied to model excitation properties of chromophores in various fluorescent proteins.^{29,30,40} The calculations of vertical excitation energies and oscillator strengths for the five lowest energy transitions were then carried out on the optimized geometries using the TDDFT method. Several scenarios considered during the optimization are reported in Table S1 of the Supporting Information.

Building Input Structures. The structures of a synthetic CRF chromophore, along with its extended version RES (Figures 1B and S1), were built using Avogadro.⁴¹ Both residues were parametrized, as described in Section S2a of the Supporting Information. The RES structure, which is composed of the CRF covalently bound to Leu64 and Val68 of the protein, was further selected as a model compound for

CPHMD^{MSAD} simulations.²⁵ The WTP was built on the basis of the crystallographic structure of mCerulean (Protein Database ID: 2WSO),²⁰ using a Leu60–Val61–Thr62–Thr63–RES– Gln69–Cys70–Phe71 fragment. To generate a mutant peptide (V61KP), Val in position 61 was mutated to Lys using Pymol.⁴² Protein models were built in the same fashion, with three additional substitutions (D148G, Y151N, and L207Q) incorporated in WAS relative to the WT form. Hydrogen atoms were added using the HBUILD facility in CHARMM,⁴³ and the structures were then solvated in a cubic box of explicit TIP3P water molecules using convpdb.pl of the MMTSB⁴⁴ toolset with a 12 Å cutoff. The appropriate number of Na⁺ and Cl⁻ ions was added to maintain neutrality. The terminal ends of both peptides and proteins were capped using ACE and CT3 patches.

An additional patch was constructed to represent the charged (deprotonated) form of CRF. The same patch was used in all subsequent thermodynamic integration (TI) and CPHMD^{MS λD} calculations. Atoms included in the patch were those that differed in partial charges between protonated and deprotonated forms of CRF (Section S2, Figure S1). Those atoms constitute the so-called titratable fragment. All corresponding bond, angle, and dihedral terms were explicitly specified in the patch. A titratable residue was simulated as a hybrid ligand with dual topology, built using the BLOCK facility in CHARMM, and included all components of the neutral and charged forms. Atoms not included in the patch were considered environment atoms and were the same for both neutral and charged forms.

Calculating pK_a of Model Compound RES. In order to obtain the pK_a of RES, which was used as a model compound in all CPHMD^{MS λD} simulations, we carried out TI⁴⁵ calculations for the two deprotonation reactions (CRF-H/ CRF⁻ and RES-H/RES⁻), as schematically shown in Figures 2 and S2. A hybrid ligand containing patched atoms of the titratable fragment was constructed for each case using the procedure described above, and the simulations were run for 3 ns using nine discrete λ windows (λ = 0.1, 0.2, 0.3, 0.4, 0.5, 0.6, 0.7, 0.8, and 0.9) following a procedure similar to the one previously used by Knight and Brooks.⁴⁶ Distance restraints were applied to the pairs of atoms of the titratable fragment using a force constant of 100 kcal mol⁻¹ Å⁻² with a zero target distance between atoms in order to keep the two (dualtopology) fragments occupying the same volume. Each system was first minimized using two rounds of 200 steps using steepest descent (SD) method, followed by 2000 steps of adopted basis Newton-Raphson, with weak harmonic restraints on heavy atoms (force constants of 2.0 and 0.1 kcal $mol^{-1} Å^{-2}$ for each run, respectively) that were released prior to the heating stage. The minimized system was then gradually heated from 100 to 298 K for 100 ps. During both the 1 ns equilibration and 2 ns production runs, the temperature was maintained at 298 K by coupling to a Langevin heat bath using a friction coefficient of 10 ps⁻¹. In all simulations, hydrogen heavy-atom bond lengths were constrained using the SHAKE⁴⁷ algorithm. The equations of motion were integrated using the Leapfrog-Verlet algorithm⁴⁷ with a time step of 2 fs. A nonbonded cutoff of 12 Å was used with electrostatic force switching ("fswitch") and van der Waals switching ("vswitch") functions between 10 and 12 Å.

All simulations were done within the BLOCK facility in CHARMM.⁴⁸ All energy terms were scaled by λ , except for the bonds, angles, and dihedrals which remained at full strength regardless of the λ value so as to retain physically reasonable

geometries. The postprocessing of the trajectories was done in CHARMM, and the free energies of deprotonation for each system (ΔG^{RES} and ΔG^{CRF}) were calculated by combining the $dU/d\lambda$ values from all λ windows of the corresponding deprotonation reaction. The value of pK_a^{RES} was then calculated on the basis of the computed $\Delta\Delta G$, using the equations represented as

$$\Delta \Delta G = \Delta G^{\text{RES}} - \Delta G^{\text{CRF}}$$
(14)

$$pK_a^{\text{RES}} = pK_a^{\text{CRF}} + \frac{1}{\ln 10k_{\text{B}}T}\Delta\Delta G$$
(15)

Details of the CPHMD^{MS λ D} **Method.** In our explicitsolvent CPHMD^{MS λ D} approach,²⁵ the titration coordinate is represented by λ , which serves as a scaling factor for each titratable residue α , and is propagated continuously between the physically relevant protonated ($\lambda_{\alpha,1} = 1$) and unprotonated ($\lambda_{\alpha,1} = 0$) states. In CPHMD^{MS λ D}, the dynamics of the λ variable is described using the multisite λ dynamics approach (MS λ D)⁴⁹ that enables a coupling between λ and the atomic coordinates. As such, in CPHMD^{MS λ D}, titratable residues are model compounds perturbed by the protein environment via nonbonded interactions. (For more details about the theory behind CPHMD^{MS λ D} simulation, we refer our readers to references 25 and 50.)

The simulation setup for CPHMD^{MS λD} simulations is similar to the one used in the TI (see above).⁴⁵ Only those aspects that are different are reported below. In particular, the BLOCK facility was used with the λ^{Nexp} functional form of λ (FNEX) and a coefficient of 5.5. A fictitious mass of 12 amu Å² was assigned to each θ_{α} value. The threshold value for assigning $\lambda_{\alpha,i}$ = 1 was $\lambda_{\alpha,i} \geq 0.8$. The values of the F^{fixed} and F^{var} biasing potentials (Table S3) were parametrized using the same method as reported previously and were targeted to maintain both (i) good sampling efficiency throughout the simulations (>50 transitions per ns, Figure S2) and (ii) a high fraction of physical ligand (~0.8).

To facilitate the convergence of sampling of protonation states, we have also employed the pH-based replica-exchange protocol, which allows the exchange between replicas representing different pH conditions. The pK_a values for each relevant structure were computed by combining the populations of the unprotonated (N^{unprot}) and protonated (N^{prot}) states in multiple runs and by fitting their ratio (S^{unprot}) to the modified Henderson–Hasselbalch equation, represented as

$$S^{\text{unprot}}(\text{pH}) = \frac{1}{1 + 10^{-(\text{pH} - pK_a)}}$$
(16)

The protocol described above was applied to compute the pK_a values of WTP and V61KP as well as WT and WAS proteins. The pH range varied depending on the system: although the WTP and V61KP were titrated over the pH range 1–16 (with an increment of 1), the high- pK_a closed WT and WAS protein conformations were sampled across an extended pH range (1–56 and 1–40, respectively). The pK_a of the open state was calculated using 16 pH replicas (1–16). In all cases, calibrated RES with pK_a 12.7 was used as a model compound, and peptide/protein environments were assumed to perturb the pK_a via nonbonded interactions only. The full thermodynamic cycle considered in this study can be found in Figure 2.

Sampling Transiently Populated States. The weightedensemble (WE) algorithm²³ enhances sampling of transiently populated states by defining a set of regions and encouraging

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equal sampling in each region. This is achieved by evolving a group of trajectories (replicas) forward in time (in parallel) and periodically redistributing trajectories between the regions using cloning and merging steps. To ensure physical sampling, each trajectory has a statistical probability (or weight, w_i) associated with it such that the sum of all weights equals one. During cloning, weights of the parent trajectories, A and B, are merged, the resulting replica has a weight of w_A+w_B , and it takes on the structure of replica A with probability $w_A/(w_A+w_B)$ or takes on the structure of replica B.

Here, the number of replicas is constant at 48, and regions are defined using a novel hydration parameter, φ , defined as

$$\varphi = \sum_{i} p_{i} \tag{17}$$

where the sum is over all water molecules i_i and p_i is defined as

$$p_{i} = \begin{cases} 1; & \text{if } d_{i} < 5\text{\AA} \\ 1 - (d_{i} - 5)/2; & \text{if } 5\text{\AA} < d_{i} < 7\text{\AA} \\ 0; & \text{if } d_{i} > 7\text{\AA} \end{cases}$$
(18)

Here, d_i is the closest distance from atom N28 of the chromophore (RES) to an atom in the water molecule *i*. Regions were defined dynamically along this parameter with a spacing of 0.2 over the course of the WE simulation. A "cycle" consists of 20 ps of sampling for all 48 walkers followed by cloning and merging steps, and the simulation was continued for 490 cycles, at which point region discovery had slowed almost to a halt. The aggregate simulation time employed is thus 9.8 ns per walker, or 470 ns. Sampling was carried out using CHARMM and implemented on graphics processing units using OpenMM5.2.⁵¹ Otherwise the simulation is implemented as specified above.

Before computing the histogram of WAS in Figure 3, a weight is computed for each sampling region using a matrixbased weight-balancing algorithm, which finds the vector of region weights (R) by solving the equation TR = R, where T is the transition matrix.²⁴ The histogram is then built using a list of replica weights and hydration parameter values collected during the WE simulation, where the replica weights are multiplied by factor *m*, defined as

$$m_i = \frac{r_i}{\sum_{\varepsilon_i} w_{\rm A}} \tag{19}$$

where r_i is the region weight determined by the matrix equation, and the denominator is the sum of the weights of all replicas in the list that are in region *i*.

To obtain starting structures for subsequent CPHMD^{MS λD} simulations, a set of regions of the histogram with significant probabilities (p > 0.001) is chosen that represents a spectrum of hydration values: 1.5–2.5, 5.5–8.0, 12–13, and 14.5–15. We then used as a starting point the structure recorded with the largest replica weight.

ASSOCIATED CONTENT

Supporting Information

Details of a computational protocol. This material is available free of charge via the Internet at http://pubs.acs.org.

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Notes

The authors declare no competing financial interests.

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