

# Automated Path Searching Reveals the Mechanism of Hydrolysis Enhancement by T4 Lysozyme Mutants

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## Methods

### Generate Initial Structures of the Three T4L variants

By using the crystal structures of Ground (G) State (PDB ID:3DMV) [1] and Excited (E) State (PDB ID: 2LCB) [2] as the templates, the initial structures of the G and E states for other two T4L variants (L99A,G113A and L99A,G113A,R119P) were generated by homology modelling via Modeller [3] (the E state of T4L-L99A,G113A,R119P, PDB ID:2LC9 [1]).

### TAPS Optimization

The initial path of the G/E interconversion for the three T4L variants were generated by targeted molecular dynamics (MD) [4], see Table S1 for the parameter set. Then, the initial path was optimized by our recently-developed path searching method—the travelling-salesman based automated path searching method (TAPS) [5,6], see Table S2 for the details of the parameter set. The flowchart of the recently-matured TAPS method is shown in Figure S1.

### Free Energy Landscape Calculation

After the path optimization for the three T4L variants (convergence check by performing the calculation of multidimensional scaling (MDS) [7] and  $\sqrt{\langle z \rangle}$  [8–10] as shown in Figure S2), we chose the final converged path (the minimum free energy path) to perform umbrella sampling simulations [11–13]. Details for the parameter set are listed in Table S3. The free energy distribution of the sampling results along PCV-s is shown in Figure S3.

**Table S1 Details of the Targeted MD [4] for T4L-L99A, T4L-L99A,G113A, and. T4L-L99A,G113A,R119P in the Present Work.**

Systems	T4L-L99A	T4L-L99A,G113A	T4L-L99A,G113A,R119P
Protein Size	2636 atoms	2639 atoms	2629 atoms
Temperature (K)	300	300	300
Na <sup>+</sup> / Cl <sup>-</sup>	10/18	10/18	10/17
Water	10331	10339	10332
Target State	E state	E state	E state
Structural alignment	C $\alpha$ of $\alpha$ -helices/ $\beta$ -sheets (except for residue 92-140)	C $\alpha$ of $\alpha$ -helices/ $\beta$ -sheets (except for residue 92-140)	C $\alpha$ of $\alpha$ -helices/ $\beta$ -sheets (except for residue 92-140)
RMSD Calculation	Heavy atoms of residue 92-140	Heavy atoms of residue 92-140	Heavy atoms of residue 92-140
Force Constant	100, 000 kJ/mol/nm <sup>2</sup>	100, 000 kJ/mol/nm <sup>2</sup>	100, 000 kJ/mol/nm <sup>2</sup>
Frame Record Frequency (ps)	0.2	0.2	0.2
Total Sampling Time (ps)	200 ps	200 ps	200 ps

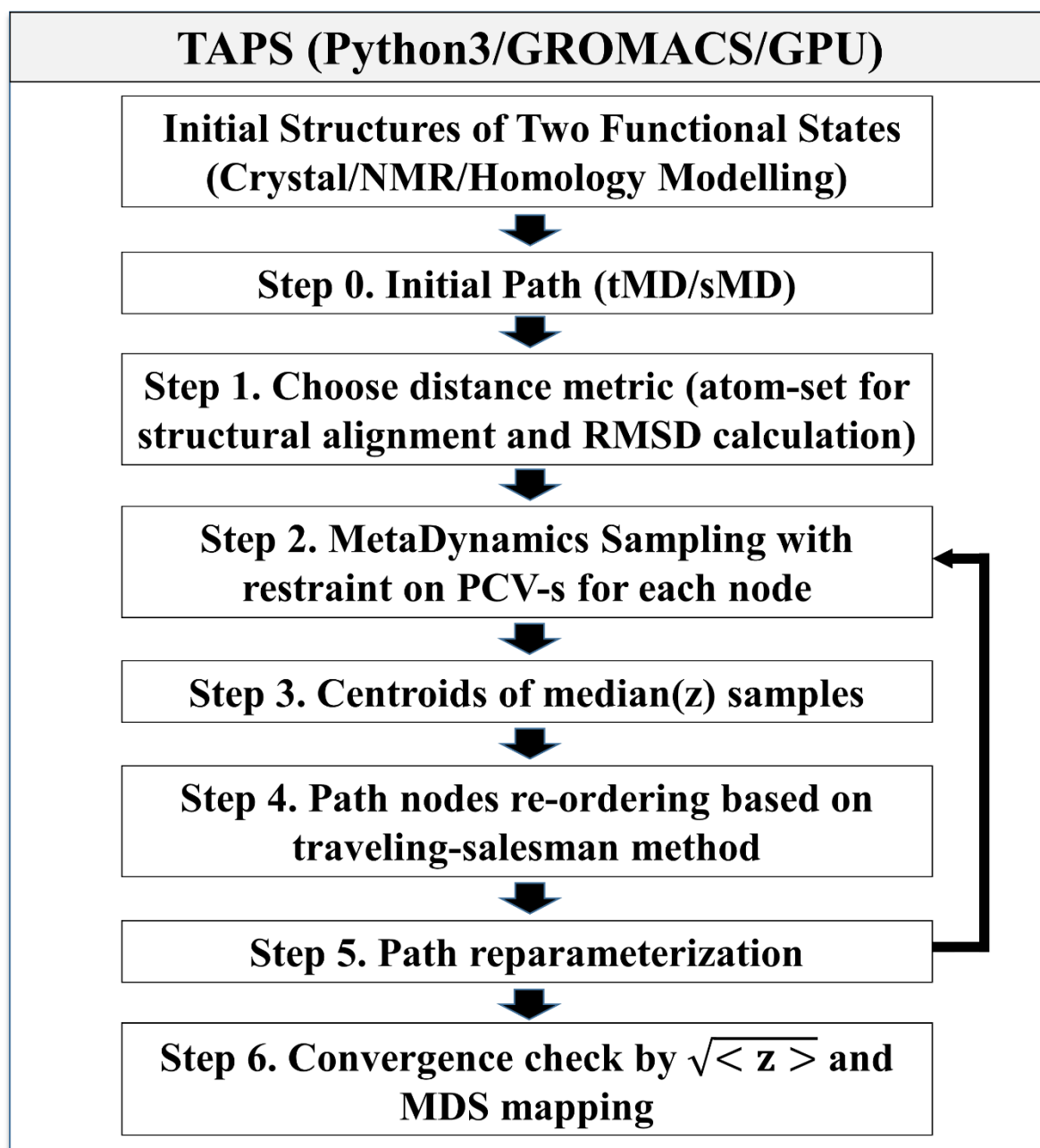
**Table S2.** The Parameters Used in TAPS<sup>a</sup> Optimization [5,6] for the Systems in the Present Work.

Systems		T4L-L99A	T4L-L99A,G113A	T4L-L99A,G113A,R119P
Sampling Time Each Iteration		1000 ps	1000 ps	1000 ps
Temperature		300 K	300 K	300 K
Atoms Set	Structural alignment	Ca of $\alpha$ -helices/ $\beta$ -sheets (except 92-140)	Ca of $\alpha$ -helices/ $\beta$ -sheets (except 92-140)	Ca of $\alpha$ -helices/ $\beta$ -sheets (except 92-140)
	RMSD calculation	Heavy atoms of residue 92-140	Heavy atoms of residue 92-140	Heavy atoms of residue 92-140
Tolerant Distance for Neighbor Nodes		0.8 Å	0.8 Å	0.8 Å
Metadynamics Well-tempered	Gaussian Height	0.25 kJ/mol	0.25 kJ/mol	0.25 kJ/mol
	Gaussian Width	0.50	0.50	0.50
	Bias Factor	10	10	10
	Length of tMD	30 ps	30 ps	30 ps
Force Constant of tMD		100, 000 kJ/mol/nm <sup>2</sup>	100, 000 kJ/mol/nm <sup>2</sup>	100, 000 kJ/mol/nm <sup>2</sup>

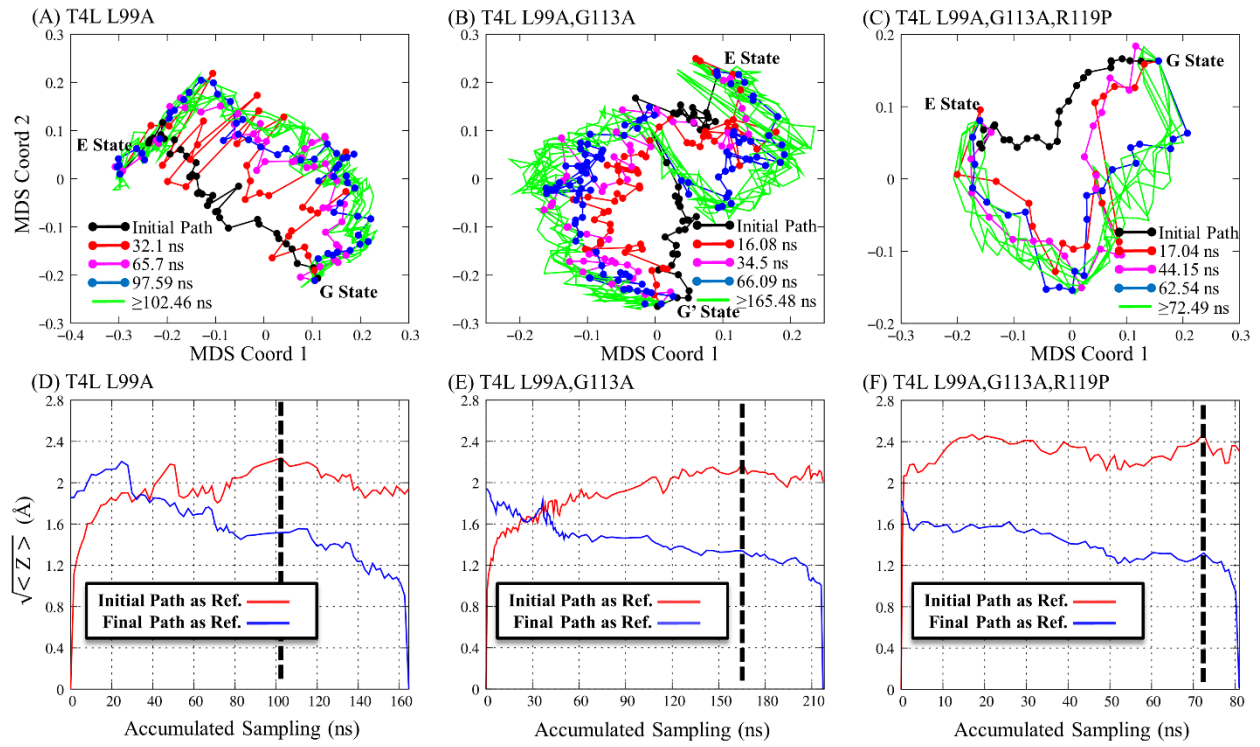
<sup>a</sup>Meaning of parameters in Refs. [5,6].**Table S3** Details of Umbrella Sampling [11] for the Systems in the Present Work.

Systems		T4L-L99A	T4L-L99A,G113A	T4L-L99A,G113A,R119P
Node Number in Final Path		54	52	51
Insert Gap		0.5	0.5	0.5
Atoms Set	Structural alignment	Ca of $\alpha$ -helices/ $\beta$ -sheets (except for residue 92-140)	Ca of $\alpha$ -helices/ $\beta$ -sheets (except for residue 92-140)	Ca of $\alpha$ -helices/ $\beta$ -sheets (except for residue 92-140)
	RMSD calculation	Heavy atoms of residue 92-140	Heavy atoms of residue 92-140	Heavy atoms of residue 92-140
Total Number of Nodes for Umbrella Sampling		108	104	102
Umbrella Sampling PCV-based	Position for z-Wall Potential	0.0064 nm <sup>2</sup>	0.0064 nm <sup>2</sup>	0.0064 nm <sup>2</sup>
	Force Constant for PCV-z	20, 000, 000.0 kJ/mol/nm <sup>2</sup>	20, 000, 000.0 kJ/mol/nm <sup>2</sup>	20, 000, 000.0 kJ/mol/nm <sup>2</sup>
	Force Constant for PCV-s	120 kJ/mol	120 kJ/mol	120 kJ/mol
	Sampling Time	2 ns	2 ns	2 ns

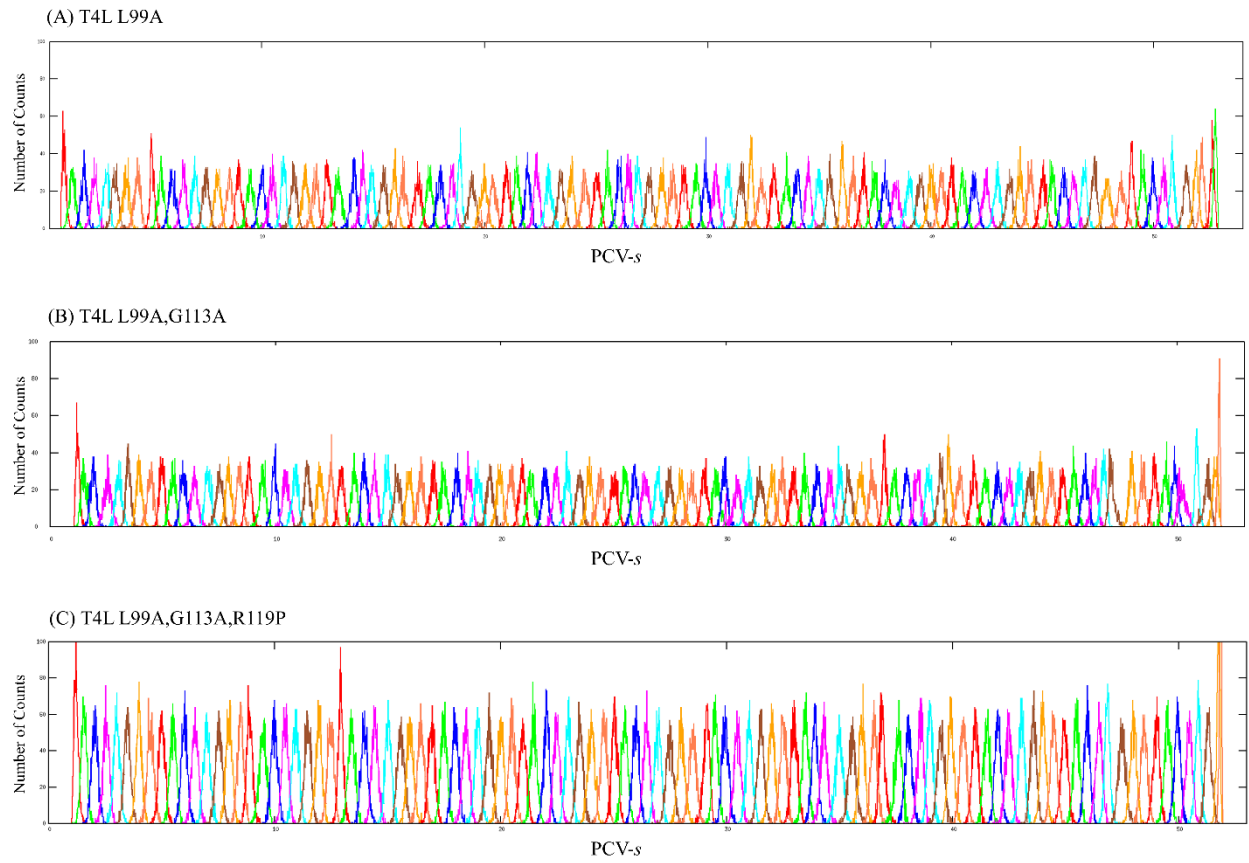
<sup>a</sup>See Figures S3 for the results of umbrella sampling [11].



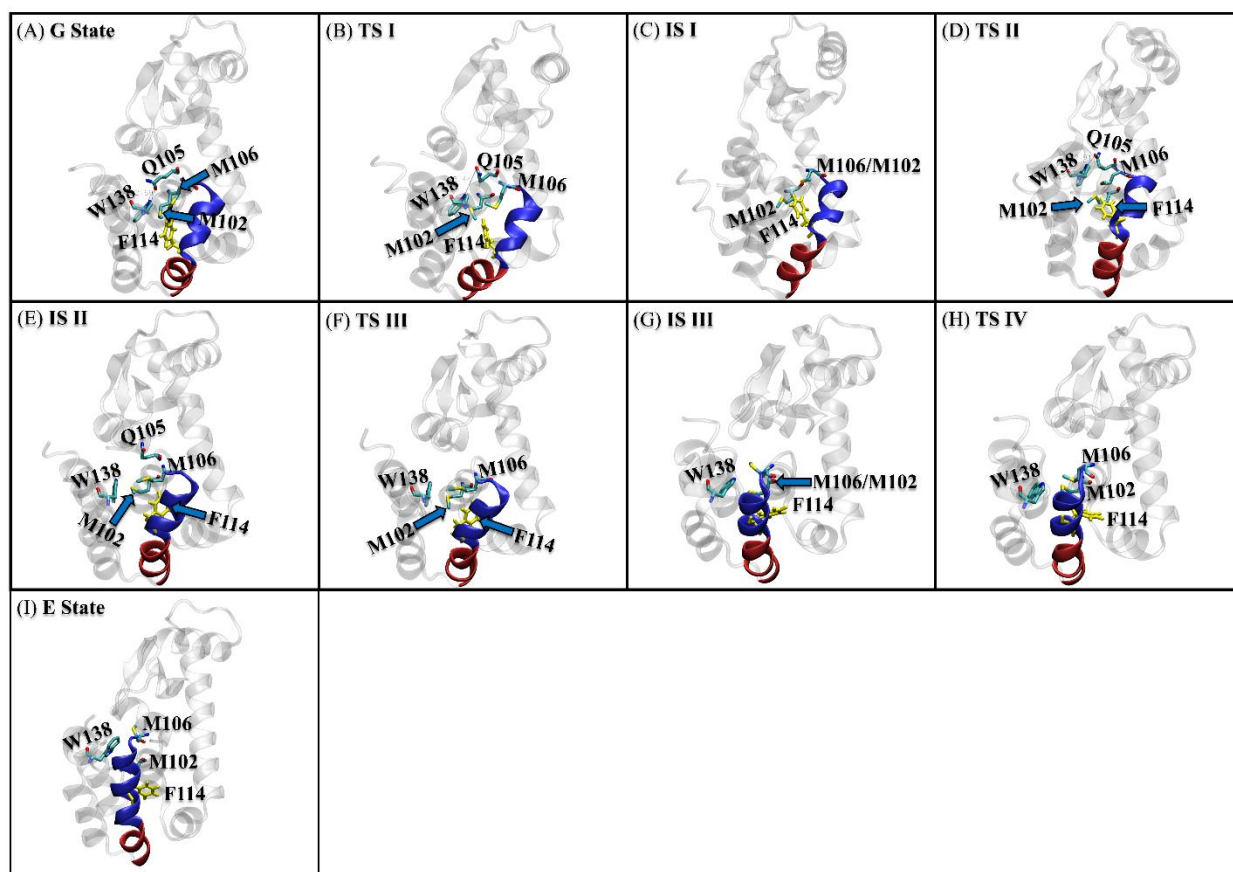
**Figure S1.** Flowchart of the Travelling-salesman Based Automated Path Searching (TAPS). The initial paths were obtained by targeted MD or steered MD. Well-tempered MetaD simulation for each node is performed parallel on the “progress component”  $s$  of the path-collective-variable (PCV) [8,14] with restraint potential on  $s$ . The backbone nodes of the new path correspond to the centroids of the sampled conformations of each node with the median value of the “deviation component”  $z$  of PCV. Re-ordering of these new nodes with a traveling-salesman scheme. Re-parameterization is finally performed to maintain the resolution of the new path (detailed in Ref [5,6]). Convergence is checked by  $\sqrt{\langle z \rangle}$  [8–10] and the visualization of the path nodes on a low-dimensional space obtained by multidimensional scaling (MDS) [7].



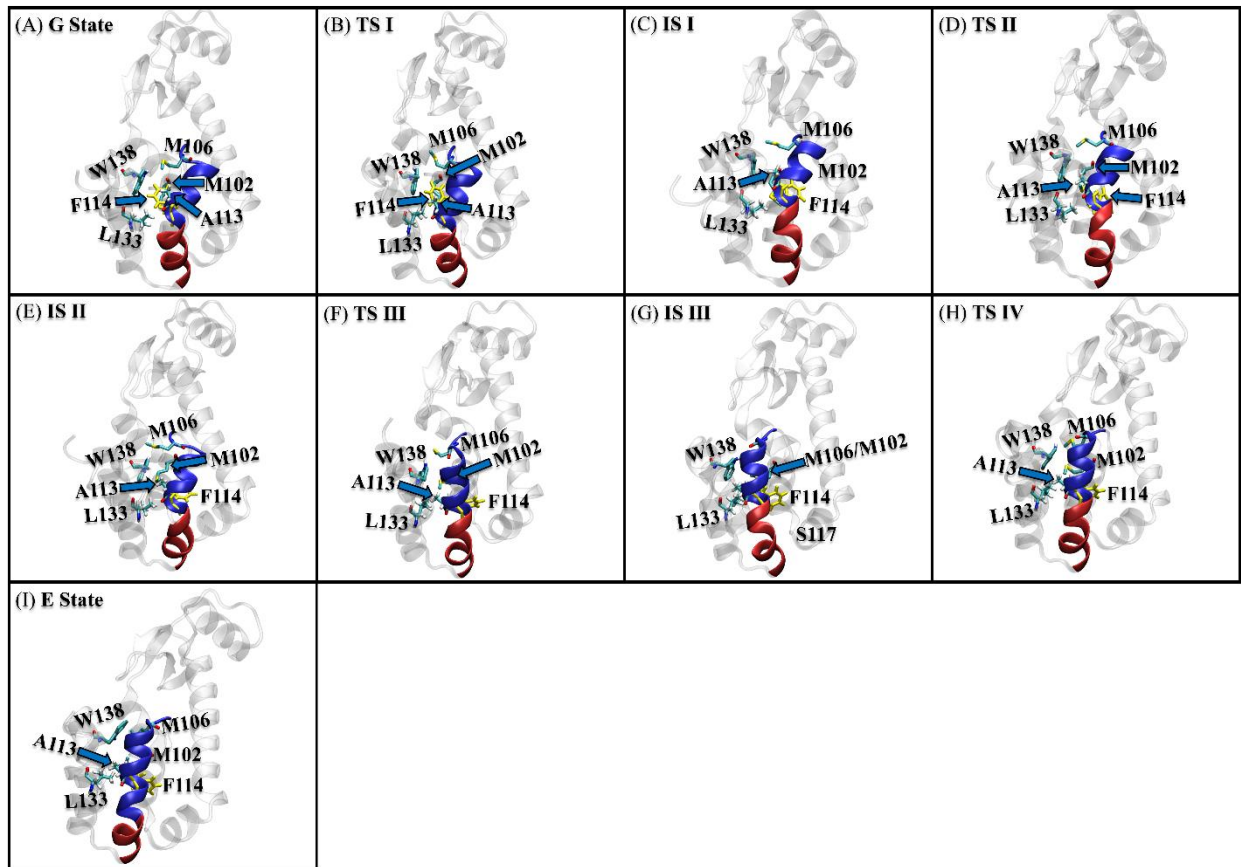
**Figure S2.** Convergence check. The paths at different TAPS iterations for the T4L-L99A (A), the T4L-L99A, G113A (B), and the T4L-L99A, G113A, R119P (C) are mapped to a two-dimensional space obtained by multidimensional scaling (MDS). The accumulated sampling time for each iteration (perpendicular sampling, additional targeted MD for path reparameterization) is highlighted by a different color. Convergence of the optimization processes for the T4L-L99A (D), the T4L-L99A,G113A (E), and the T4L-L99A,G113A,R119P (F) is measured by the progress of  $\langle z \rangle$  along the accumulated sampling time. Black and orange lines denote two different reference paths respectively: initial path (black) and final path (orange). Convergence time is highlighted by black dashed lines.



**Figure S3.** Sample distribution in all windows of the umbrella sampling [7] along the PCV-s for the T4L-L99A (A), the T4L-L99A,G113A (B), and the T4L-L99A,G113A,R119P (C). The initial 200 ps of sampling trajectory were disregarded, and only the last 1.8 ns of sampling was used for WHAM analysis.

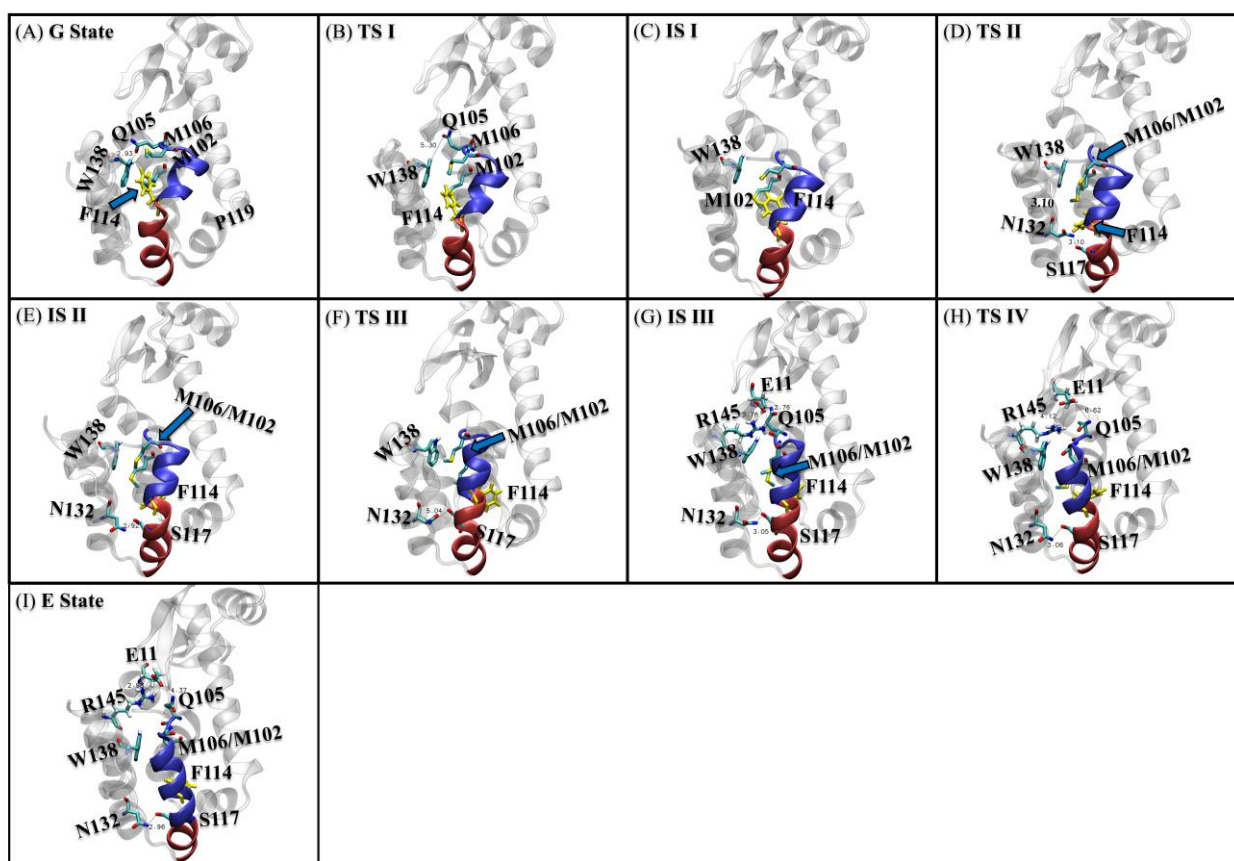


**Figure S4.** (A-I) Complete structures for the transition of the T4L-L99A system from G state to E state. The same ISs and TSs defined in Figure 2A are also shown here. All the structures were displayed by VMD [15].

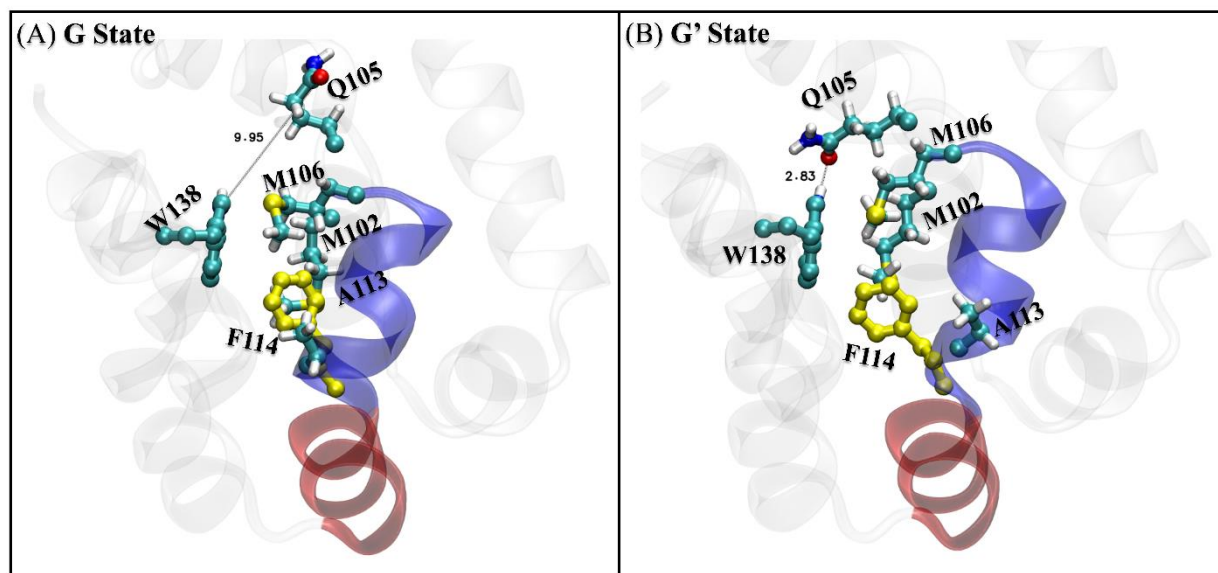


**Figure S5.** (A-I) Complete structures for the transition of the T4L-L99A,G113A mutant from G state to E state. The same ISs and TSs defined in Figure 2B are also shown here. All the structures were displayed by VMD [15].



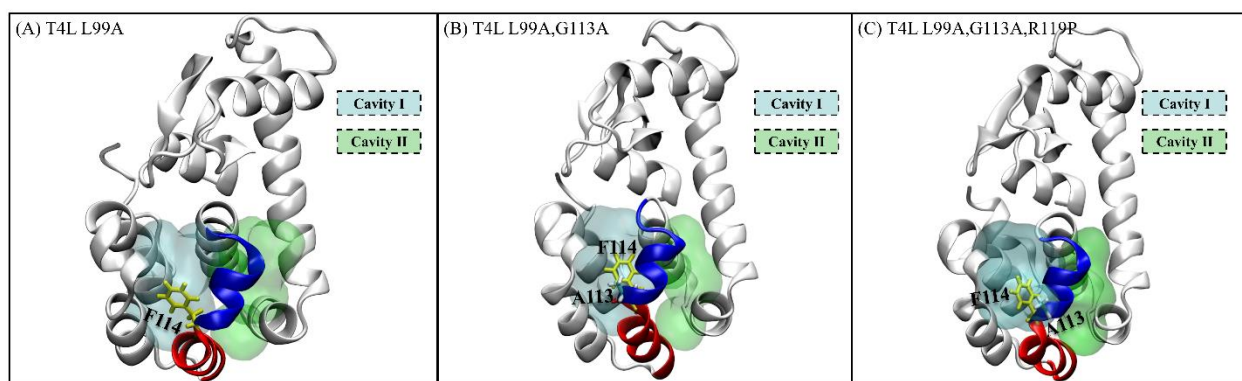


**Figure S6.** (A-I) Complete structures for the transition of the T4L-L99A,G113A,R119P mutant from G state to E state. The same ISs and TSs defined in Figure 2C are also shown here. All the structures were displayed by VMD [15].

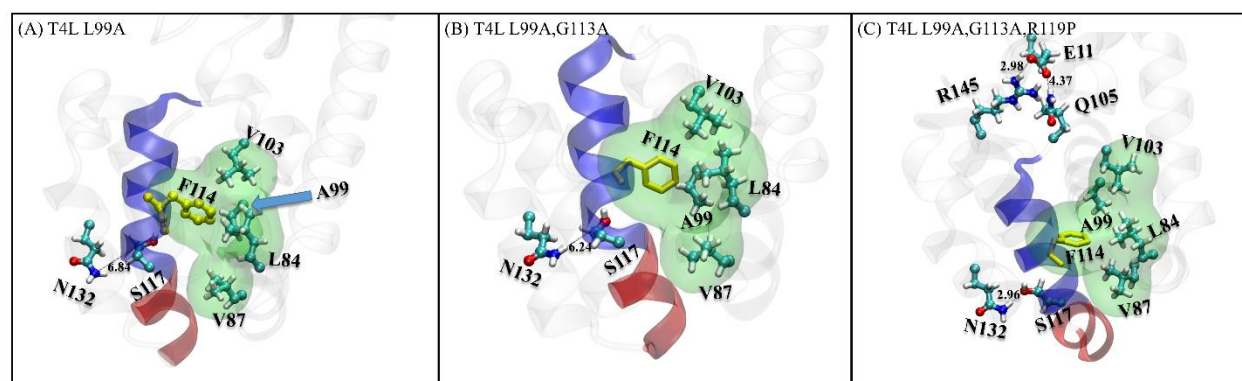


**Figure S7.** Details of the structures for the G state (A) identified in Figure 2B and the initial guess (G' state, B) for the T4L-L99A,G113A mutant. All the structures were displayed by VMD [15].

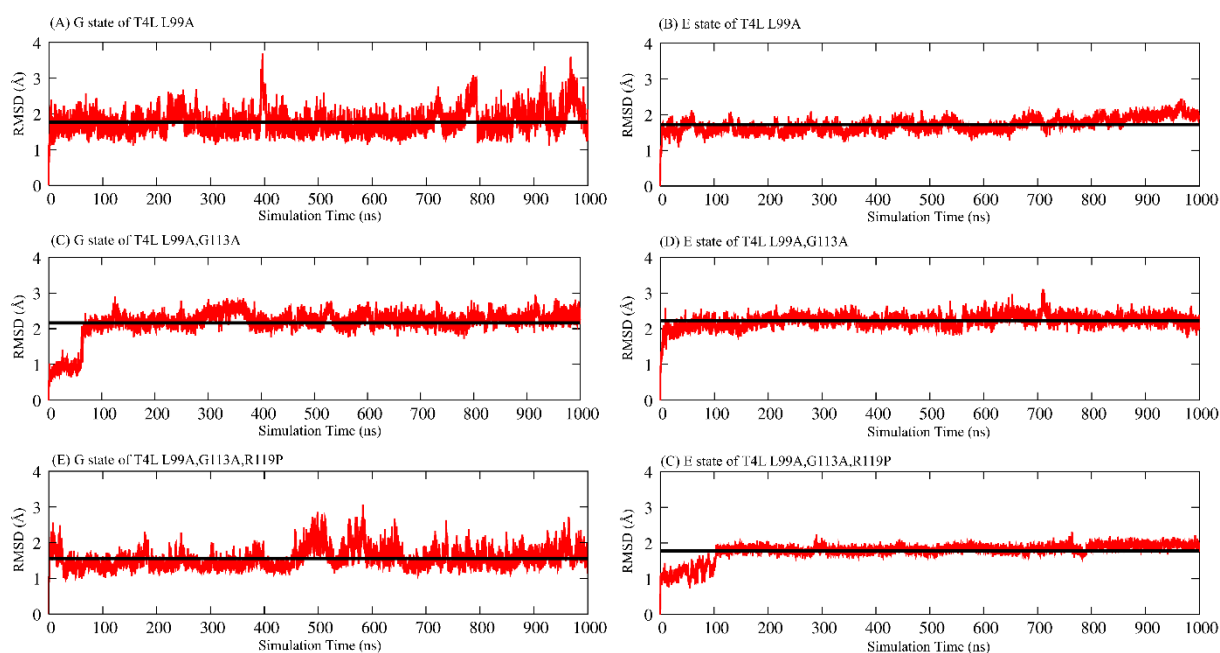




**Figure S8.** (A-C) Details of the structures for G state of the three T4L variants: the T4L-L99A (A), the T4L-L99A,G113A (B), and the T4L-L99A,G113A,R119P (C). The two hydrophobic cavities: Cavity I and Cavity II are highlighted by cyan and green colors respectively. All the structures were displayed by VMD [15].

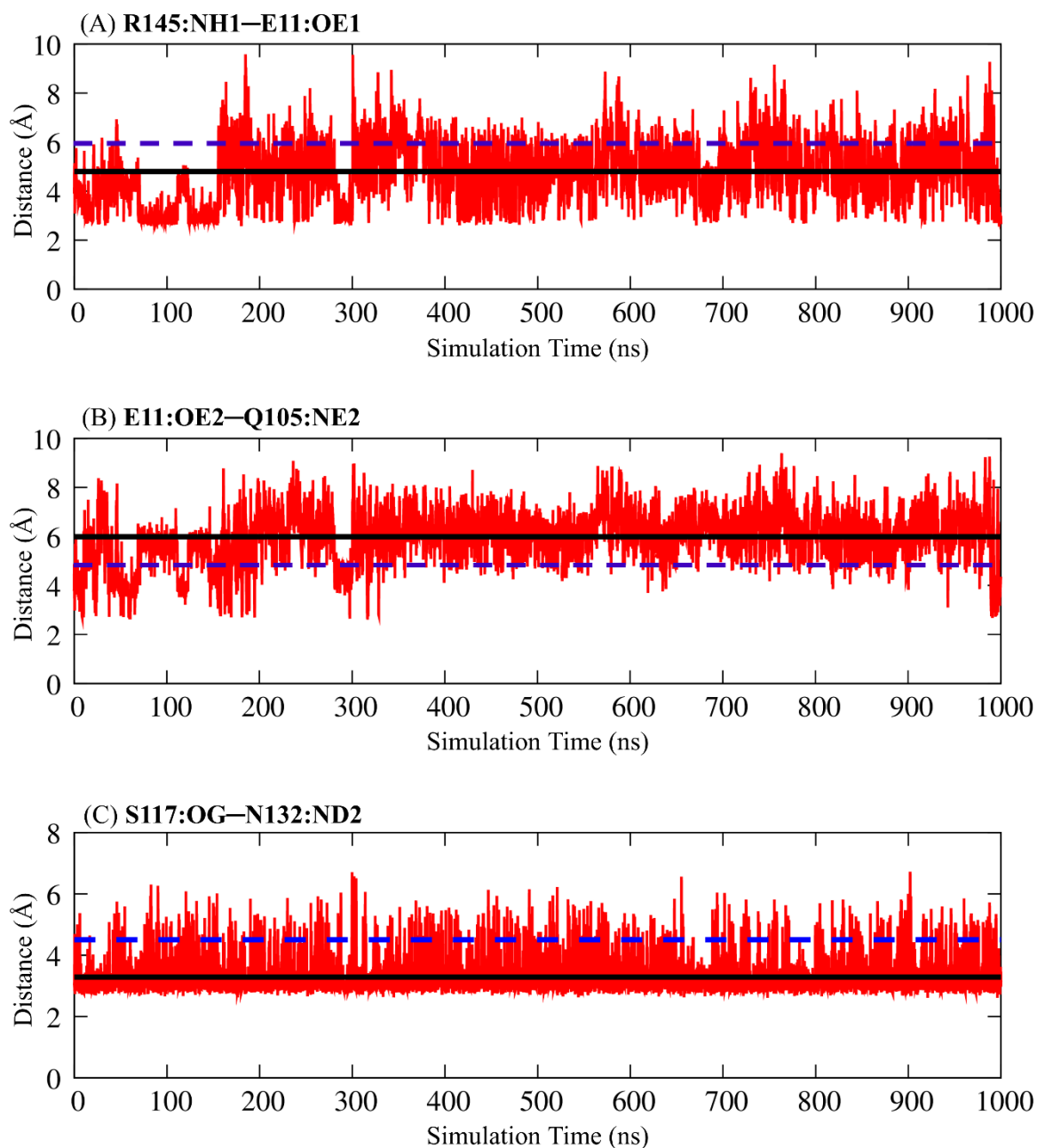


**Figure S9.** (A-C) Details of the structures for E state of the three T4L variants: the T4L-L99A (A), the T4L-L99A,G113A (B), and the T4L-L99A,G113A,R119P (C). The hydrophobic cavity II is highlighted by green color. All the structures were displayed by VMD [15].

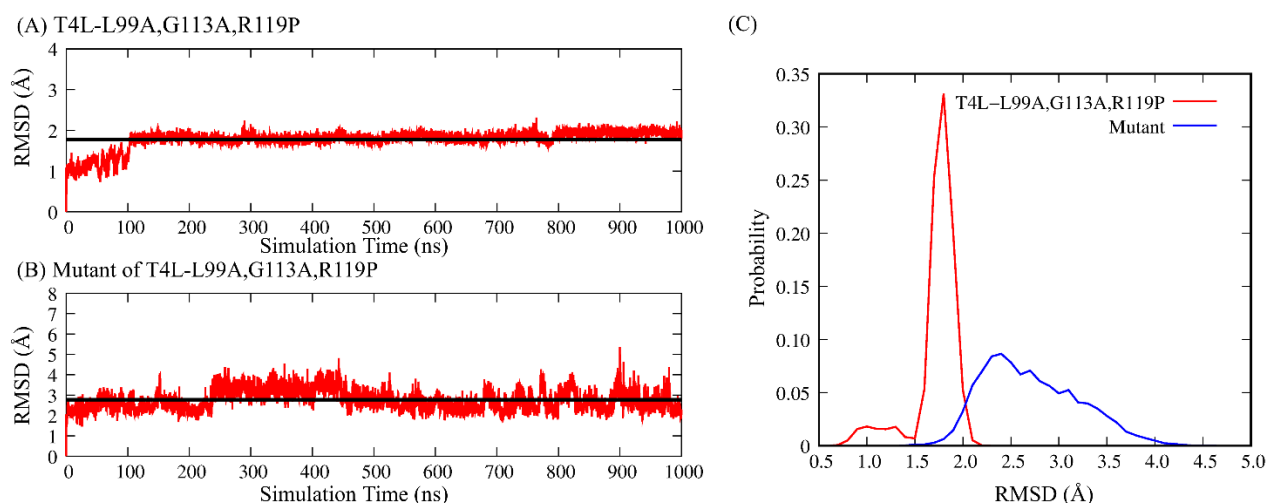


**Figure S10.** Unbiased MD simulations of the G and E states for all three mutants. Time evolution of the RMSD for the residues (92-140) within Cavity I and Cavity II for (A) the G state of T4L-L99A and (B) the E state of T4L-L99A; (C) the G state of T4L-L99A,G113A and (D) the E state of T4L-

L99A,G113A; (E) the G state of T4L-L99A,G113A,R119P and (F) the E state of T4L-L99A,G113A,R119P.

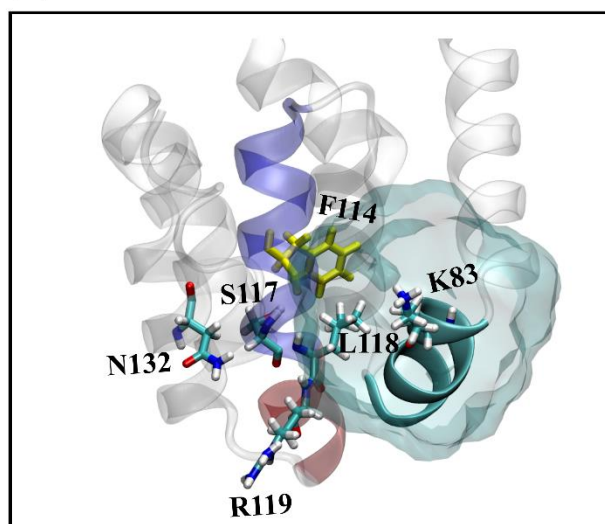


**Figure S11.** Unbiased MD simulation of the E state of the triple mutant T4L-L99A, G113A, R119P. (A) Time evolution of the distance between the atoms R145<sub>NH1</sub> and E11<sub>OE1</sub>. (B) Time evolution of the distance between E11<sub>OE2</sub> and Q105<sub>NE2</sub> (cut-off distance 5.0 Å). (C) Time evolution of the distance between S117<sub>OG</sub> and N132<sub>ND2</sub> (cut-off distance 4.5 Å).

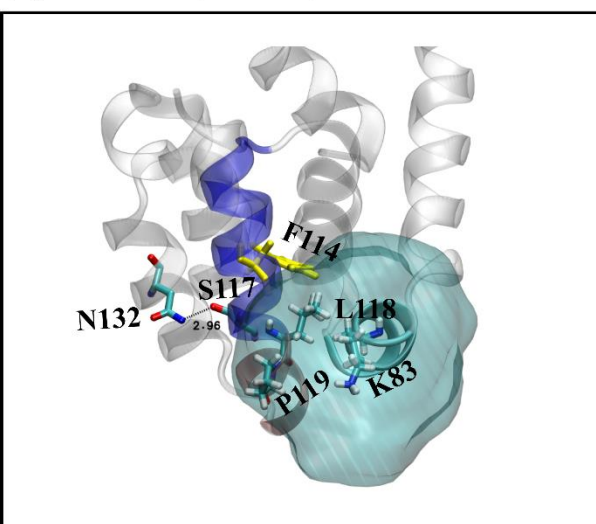


**Figure S12.** The RMSD for the residues (92-140) within cavity I and cavity II for triple mutant T4L-L99A, G113A, R119P and a sextuple mutant with three additional mutations Q105L, S117A and R145L. **(A)** Time evolution of RMSD for the E state of T4L-L99A,G113A,R119P; **(B)** Time evolution of RMSD for the E state of the sextuple mutant; **(C)** Probability distribution of the RMSD for the E state of the triple mutant (red line) and sextuple mutant (blue line).

**(A) T4L L99A**



**(B) T4L L99A,G113A,R119P**



**Figure S13.** **(A,B)** The shape of the space within 6 Å around K83 (transparent, cyan) for the T4L-L99A **(A)**, and the T4L-L99A, G113A **(B)**. All the structures were displayed by VMD [15].

## References

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