Original Article

Free-energy landscape of molecular interactions between endothelin 1 and human endothelin type B receptor: fly-casting mechanism

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Abstract

The free-energy landscape of interaction between a medium-sized peptide, endothelin 1 (ET1), and its receptor, human endothelin type B receptor (hETB), was computed using multidimensional virtual-system coupled molecular dynamics, which controls the system's motions by introducing multiple reaction coordinates. The hETB embedded in lipid bilayer was immersed in explicit solvent. All molecules were expressed as all-atom models. The resultant free-energy landscape had five ranges with decreasing ET1-hETB distance; completely dissociative, outside-gate, gate, binding pocket, and genuine-bound ranges. In the completely dissociative range, no ET1-hETB interaction appeared. In the outside-gate range, an ET1-hETB attractive interaction was the flycasting mechanism. In the gate range, the ET1 orientational variety decreased rapidly. In the binding pocket range, ET1 was in a narrow pathway with a steep free-energy slope. In the genuine-bound range, ET1 was in a stable free-energy basin. A G-protein-coupled receptor (GPCR) might capture its ligand from a distant place.

Key words: enhanced sampling, generalized ensemble, GPCR, membrane protein molecular docking, molecular dynamics, potential of mean force

Introduction

Interaction of proteins with small compounds, peptides, proteins, and DNA has been studied not only in basic life sciences but also in applied research, such as drug discovery and design. When the ligand is small, in silico screening has been effective to predict the ligand-receptor complex structure, where molecular-surface and surface-charge complementarities are used for prediction, and where the stability of the proposed complex structure is assessed using empirical score functions. This approach is now a useful prediction tool (Fukunishi, 2009, 2010; Pagadala et al., 2017), although some shortcomings in the screening technique have been pointed out (Scior et al., 2012).

With increasing ligand size, the conformational flexibility of a ligand and its receptor becomes non-negligible. Even a medium-sized

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ligand might take multiple conformations that are considerably different from one another. Furthermore, the intermolecular interface increases, making the ligand–receptor interactions complicated. Then, the empirical score functions might become insufficient to assess the complex-structure stability. More difficulty emerges when the ligand or its receptor is highly disordered in the unbound state (intrinsically disordered state) (Higo *et al.*, 2011; Iida *et al.*, 2019; Levine *et al.*, 2015; Tompa and Fuxreiter, 2008; Umezawa *et al.*, 2012; van der Lee *et al.*, 2014). Recent reports have described that some receptors have a cryptic binding site that is hidden in the unbound state and which is exposed when binding to its ligand (Bowman and Geissler, 2012; Cimermancic *et al.*, 2016; Oleinikovas *et al.*, 2016).

To approach the difficult problems described above, physically rigorous and precise methods are required in which the biomolecules are expressed by all-atom models and are flexible as they are fluctuating in solution. A salient benefit of these basic approaches is this: not only the final product (the most-stable complex structure) but also transitional products (i.e. semi-stable structures) are searched. In principle, the stability of a stable structure is valued by freeenergy, which is computable using physically rigorous methods, in theory.

Many computational methods have been proposed based on the above-described physical approaches to raise sampling efficiency and accuracy of stability (Aldeghi et al., 2016; Athanasiou et al., 2017; Clark et al., 2016; Fujitani et al., 2009; Fukunishi and Nakamura, 2013; Gralter et al., 2005; Ikebe et al., 2014; Jayachandran et al., 2006; Kamiya et al., 2008; Lee and Olson, 2006; Luzhkov, 2017; Mobley et al., 2007; Ostermeir and Zacharias, 2017; Pérez-Benito et al., 2018; Soederhjelm et al., 2012; Steinbrecher and Labahn 2010; Suenaga et al., 2012; Sun et al., 2017; Villarreal et al., 2017; Wang et al., 1999, 2006, 2013). These methods advanced the ability to elucidate biomolecular interaction mechanisms. However, there is a complicated process by which two or more elementary sub-processes take place simultaneously or sequentially to complete the complex formation/dissociation. Scheme S1 presents such a complicated process, where the binding pocket of the receptor is deep, and binding/ unbinding occurs via change of the ligand-receptor distance and opening of the binding pocket. Consequently, to elucidate such a process, a powerful sampling method is required.

Generalized ensemble methods (Iida *et al.*, 2016; Mitsutake *et al.*, 2001) were proposed to increase sampling efficiency. Their benefit is not only the powerful sampling efficiency but also reproducibility of a thermodynamic weight assigned to each sampled snapshot at a given temperature (room temperature in many cases). Given the thermodynamic weight, one can generate a free-energy landscape that specifies stable states (free-energy basins) emerging in conformational changes. Recently, we applied a generalized ensemble method, multicanonical molecular dynamics (MD), to a system consisting of an intrinsically disordered protein (IDP) and its partner using an all-atom model in an explicit solvent, and obtained the free-energy landscapes (Higo *et al.*, 2011; Iida *et al.*, 2019; Umezawa *et al.*, 2012). Powerful and thermodynamically valid sampling methods are useful to study such a complicated biomolecular process.

Molecular binding and unbinding are phenomena by which the ligand and the receptor mutually approach/separate. If the intermolecular distance is controlled during a simulation, then sampling might be enhanced. Adaptive umbrella sampling (AUS) introduces a reaction coordinate (RC), which is calculated uniquely from the system's conformation, and which controls the motion along the RC. Consequently, AUS is a suitable method to sample molecular binding/unbinding (Dasgupta *et al.*, 2016). Supplementary subsection 1 presents additional details.

However, a single RC is insufficient to control the binding/unbinding motions as shown in Scheme S1. Instead, two or more RCs are necessary to raise the sampling efficiency. In theory, AUS can adopt multiple RCs by introducing a multidimensional canonical distribution function $P_{\text{cano}}(\lambda_1, \lambda_2, \dots; T)$, where λ_i stands for the *i*-th RC and T represents the simulation temperature. By replacing $P_{\text{cano}}(\lambda, T)$ with $P_{\text{cano}}(\lambda_1, \lambda_2, \dots; T)$ in Eq. S1, a long AUS simulation can sample the multidimensional space uniformly; the freeenergy landscape is obtained in the RC space. Practically speaking, however, convergence of a multidimensional function is considerably slower than that of a one-dimensional (1D) function. The number of RCs can be expected to increase concomitantly with increasing system complexity; then the performance decreases.

Endothelin 1 (ET1) is a medium-sized ligand (21-residue long) known as a strong vasoconstrictor discovered in humans (Yanagisawa et al., 1988). The tertiary structure was resolved using nuclear magnetic resonance (NMR) (Takashima et al., 2004) and X-ray crystallography (Janes et al., 1994). In those earlier studies, the Nterminal region adopts a strand. The middle region forms an α helix. Its tertiary structure is stable despite its short polypeptide length because two disulfide bonds link the strand and α -helix. ET1 transmits signals by interacting with two homologous receptors, the endothelin type A (Arai et al., 1990) and endothelin type B (Sakurai et al., 1990) receptors, which are membrane proteins belonging to G-protein-coupled receptors (GPCRs). The complex structure of human endothelin type B receptor (hETB) and ET1 was solved using X-ray crystallography (Shihoya et al., 2016). In this complex, ET1 is bound to a deep binding pocket of hETB. Earlier reports show that this binding is quasi-irreversibly strong (Hilal-Dandan et al., 1997). The gate of the binding pocket is likely to open when ET1 goes through the binding pocket, as illustrated in Scheme S1.

Recently, we developed a generalized ensemble method, multidimensional virtual-system coupled MD (mD-VcMD) (Hayami *et al.*, 2018). This method can adopt multiple RCs readily. Furthermore, less-interesting conformations can be eliminated from sampling using a simple selective-sampling technique, which shortens and simplifies the related computational tasks. We applied mD-VcMD to the ET1– hETB system to obtain the free-energy landscape for ET1–hETB interaction. It is particularly interesting that an attractive interaction between ET1 and hETB was observed when ET1 was outside the binding pocket of hETB. This attractive interaction was confirmed by performing conventional MD simulations.

Materials and Methods

The detailed theory and procedures of mD-VcMD have been given in Supplementary Information and other papers (Hayami *et al.*, 2018, 2019; Higo *et al.*, 2017a,b). Therefore, a brief method is described here. Special terms/notations introduced in this article are listed in Table S1 for clarification.

Overview of mD-VcMD

We first introduce multiple RCs: $\lambda = [\lambda_1, \dots, \lambda_{N_{R_c}}]$, which construct an N_{R_c} -dimensional $(N_{R_c}D)$ conformational space to be sampled. As presented in Fig. 1A, each RC axis is divided into *RC zones* (or simply *zones*): { $z_i^{(b)}$; $i = 1, \dots, nvs(h)$ }, where *i* is an index specifying the *i*-th zone along λ_b , and nvs(h) is the number of zones



Fig. 1 Schematic illustration of the virtual system. (A) Division of RC axis λ_b ($b = 1, ..., N_{Rc}$) into RC zones $\{z_i^{(b)}\}$ (i = 1, ..., nvs(b)), where $\Delta \lambda_i^{(b)}$ is the width of the *i*-th zone, and nvs(b) represents the number of zones along λ_b . The minimum and maximum values of the *i*-th zone are expressed, respectively, as $[z_i^{(b)}]_{min}$ and $[z_i^{(b)}]_{max}$. (B) Division of 2D RC space ($\lambda_1 - \lambda_2$) into 2D zones. Periphery and corner regions are designated, respectively, as "phr" and "cnr". Shaded area is an RC zone intersection. Broken-line frame is described in Supplementary subsection 2. (C) Close-up of 2D RC space, where four zones ($z_{L^{(1)}}, z_{L^{(2)}}, z_{L^{(3)}}, and z_{L^{(4)}}$ shown by differently colored frames) overlap in the RC-zone intersection. Conformation is currently at position λ . If the current virtual state is $L^{(i)}$, then the system belongs to $z_{L^{(i)}, i}$ in which λ is confined. λ' is mentioned in the text.

set along λ_b . The width of $z_i^{(b)}$ is denoted as $\Delta \lambda_i^{(b)}$. When using two RCs, the two-dimensional (2D) RC space is divided into 2D zones as presented in Fig. 1B. In general, a zone in the N_{Rc}D RC space is represented by an N_{Rc}D vector as $z_L = [z_{L_1}^{(1)}, z_{L_2}^{(2)}, \dots, z_{L_{N_{Rc}}}^{(N_{Rc})}]$ (Eq. S3), where L_b is an index of the L_b -th zone along λ_b , and L is a vector integrating all the indices as $L = [L_1, L_2, \dots, L_{N_{Rc}}]$ (Eq. S2). Supplementary subsection 2 presents additional details.

In mD-VcMD, we set walls at the zone boundaries to confine λ in a zone and allow inter-zone transitions occasionally in a simulation (Supplementary subsection 5). Consequently, it is mandatory to specify to which zone λ is confined currently. The zone is designated as a currently confining zone (or simply current zone). Fig. 1C is a portion of the 2D RC space, where $\boldsymbol{\lambda}$ is in a shaded region shared by zones $z_{L^{(1)}}, z_{L^{(2)}}, z_{L^{(3)}},$ and $z_{L^{(4)}}.$ We refer, respectively, to this shaded region and the zones $\{\bar{z_{L^{(1)}}}, \cdots, \bar{z_{L^{(4)}}}\}$ as the RCzone intersection (or simply intersection) and linked RC zones (or simply linked zones). In general, we designate the number of the linked zones sharing an intersection as n_{link} , and designate the linked zones as $\{z_{L^{(1)}}, \cdots, z_{L^{(n_{\text{link}})}}\}$, where $L^{(i)}$ is the index for the *i*-th linked RC zone. If the current RC zone is $z_{L^{(1)}}$ in Fig. 1C, then λ moves within the red frame. Members of the linked RC zones might change according to the conformational motion (CFM): if λ moves to λ' within $z_{I(1)}$, then $z_{I(2)}$ and $z_{I(4)}$ are eliminated from the linked RC zone, and other two zones join in the linked RC zones. Supplementary subsection 3 provides additional details. Fig. S1A is another representation of Fig. 1C.

We defined the potential energy E_{entire} of the system as

$$E_{\text{entire}}(\mathbf{r}, L) = E_{\text{R}}(\mathbf{r}) + E_{\text{V}}(L) + E_{\text{RV}}(\lambda, L).$$
 1

Two dynamic variables r and L specify E_{entire} . E_{R} is the original potential energy described by the system's conformation r, where $r = [x_1, y_1, z_1, x_2, y_2, z_2, \cdots]$, and x_i, y_i , and z_i , respectively, represent the x-, y-, and z-coordinates of atom i. $E_{\text{RV}}(\lambda, L)$ is introduced to confine λ in the current RC zone z_L . Also, $E_{\text{V}}(L)$ controls a transition of the current zone from z_L to $z_{L'}$. Supplementary subsection 4 presents actual forms of $E_{\text{RV}}(\lambda, L)$ and $E_{\text{V}}(L)$.

We refer to the system expressed by r as the *real system*. Whereas L was introduced originally as an RC-zone index, now it is a dynamic variable. In contrast to continuous variable r, L is a discrete one, and transition $L \rightarrow L'$ causes switching the current zone: $z_L \rightarrow z_{L'}$. Introduction of L implies that a sub-system (*virtual system*) expressed by L exists virtually. Here, we rename a zone index L as a *virtual state*. The index for the current RC zone is called a *current virtual state*. Similarly, indices to specify the linked RC zones $\{L^{(1)}, \dots, L^{(n_{link})}\}$ are called *linked virtual states*.

Variables r and L evolve in simulation: $r \rightarrow r + \Delta r$ and $L \rightarrow L'$, and λ moves accordingly as $\lambda(r) \rightarrow \lambda(r + \Delta r)$. We refer to the motion of r as CFM and to the transition of L as an inter-virtual state transition (IVT). Practically speaking, r time evolves in z_L for a time interval with fixing L; then L is transitioned to one of the linked virtual states at the end of the time interval with fixing r: the pair of CFG and IVT composes a cycle. Then, the cycle is repeated many



Fig. 2 (A) Initial conformation of simulation, and (B) ET1–hETB complex in membrane viewed from a slightly different direction. RCs λ_1 and λ_2 are shown, respectively, by magenta and green arrows. Other RCs $[\lambda_3, \cdots, \lambda_7]$ are shown in Fig. S5.

times. Supplementary subsection 5 presents additional details. CFM is controlled by the usual MD protocol, where forces acting on an atom are calculated as $-\nabla E_{\text{entire}} = -\nabla E_{\text{R}} - \nabla E_{\text{V}} - \nabla E_{\text{RV}}$. Term $-\nabla E_{\text{R}}$ is an ordinary force used in conventional MD. Here, E_{V} does not affect CFM ($\nabla E_{\text{V}} = 0$; Eq. S6) because E_{V} is constant in the time interval (*L* is fixed). E_{RV} affects CFM only when λ goes outside z_L : $\nabla E_{\text{RV}} \neq 0$ for $\lambda \notin z_L$ (Eq. S4). For IVT, we use a Monte-Carlo method with assignment of transition probabilities among linked virtual states.

An optimal set of IVT probabilities (Eq. S7) is used for effective sampling (Higo *et al.*, 2017a,b). The optimal set is unknown *a priori*. Therefore, iterative simulations are required to search the optimal set (Supplementary subsection 6). A simulation provides a *virtual state-partitioned probability* Q_{entire} and a *virtual state-partitioned canonical probability* Q_{cano} in the multidimensional RC space. Then, the simulation is performed iteratively until convergence of Q_{entire} and Q_{cano} . Finally, a low-dimensional potential of mean force (PMF) is obtained by projecting Q_{cano} to the lower dimensional space.

ET1-hETB system and simulation

Here, system generation is outlined. Supplementary subsection 8 represents related details. First, the ET1-hETB complex structure was generated referring to the crystallographic structure (PDB ID: 5glh). After some modifications, the complex was embedded in the 1-Palmitoyl-2-oleoyl-sn-glycero-3-phosphorylcholine (POPC) membrane. Four cholesterols were introduced into the hETB-membrane interface. Finally, the system was immersed in a periodic box filled by solvent.

After energy minimization of the system generated above, short constant-volume and constant-temperature (NVT) simulation, 200ps constant-pressure and constant temperature (NPT) simulation, and 100-ps NVT simulations at 300 K were performed sequentially using a computer program psygene (Mashimo *et al.*, 2013) from the myPresto package (https://www.mypresto5.jp/en/) (Fukunishi *et al.*, 2003). The resultant periodic box size was 70.2 × 71.0 × 125.2 Å. We regard this conformation as the *native complex structure* (Fig. 2), which was used for the initial conformation of mD-VcMD.

The mD-VcMD simulation was performed using a program omegagene/myPresto (Kasahara et al., 2016) with the following

condition: SHAKE algorithm (Ryckaert et al., 1977) to fix the covalent-bond lengths related to hydrogen atoms, Berendsen thermostat to control temperature (Berendsen et al., 1984), the zerodipole summation method (Kamiya et al., 2013; Fukuda et al., 2011, 2012) for long-range electrostatic computations, a time-step of 2 fs, and simulation temperature of 300 K. An ensemble resulted from the Berendsen thermostat converges on a canonical distribution for a system of many atoms, whereas it generates a non-physical distribution for a small system (Morishita, 2000). To compute the potential energy, the Amber hybrid force fields (mixture parameter w = 0.75 (Kamiya et al., 2005) was used for hETB and ET1, the Amber lipid force field for POPC lipid (Dickson et al., 2014), TIP3P model for water molecule (Jorgensen et al., 1983), and force fields for chloride and sodium ions (Joung and Cheatham, 2008). The cholesterol force field was generated as described hereinafter. First, the atomic partial charges were derived by quantum chemical calculations using Gaussian03 (Frisch et al., 2004) at the HF/6-31G* level, followed by Restrained Electrostatic Potential (RESP) fitting (Bayly et al., 1993). Then, those partial charges were incorporated into a general AMBER force field (GAFF) file (Wang et al., 2004) using Amber tools14 (Salomon-Ferrer et al., 2013).

To raise the sampling efficiency further, a trivial trajectoryparallelization technique was used (Higo *et al.*, 2009; Ikebe *et al.*, 2011), where many independent runs were performed in parallel from different initial conformations. The last snapshot from a run of iteration M was used for the initial conformation of the successive run of iteration M + 1, although the first iterative runs were initiated from the single conformation (Fig. 2A). The actual number of runs for each iteration was 2176. An ensemble of snapshots picked from the multiple production runs was used to analyze the system properties.

Setting RCs

In the current version of mD-VcMD (Hayami *et al.*, 2018), an RC, λ_i , is defined by an inter-centroid distance between two atom groups denoted as $G1(\lambda_i)$ and $G2(\lambda_i)$, although RC is definable by various ways in general. We introduced seven RCs [$\lambda_1, \dots \lambda_7$] by performing preliminary simulations. Consequently, mD-VcMD is given as 7D-VcMD in this article. Supplementary subsection 9, Fig. S5, and Table S2 all provide related details.

We briefly explain RCs: λ_1 is the ET1-hETB distance. λ_2 is the gate-width of the binding pocket of hETB. λ_3 is the distance between hETB and the farthest part of ET1 from hETB in the native complex structure (Fig. S5C), which is introduced for selectively sampling the ET1 orientation, as described in the following section. By the selective sampling, the ET1 orientation was approximately maintained as in the native complex structure. Less-interesting conformations were eliminated from sampling. Furthermore, the computational task was reduced. The other four RCs [$\lambda_4, \dots, \lambda_7$] are introduced to prevent ET1 from unfolding during simulation. Although five RCs [$\lambda_3, \dots, \lambda_7$] were introduced for conformational restraints, these restraints do not affect Q_{entire} and Q_{cano} of virtual states to be sampled (Higo *et al.*, 2017b). The RC values for the native complex structure were $\lambda^{(\text{ref})} = [\lambda_1^{(\text{ref})}, \dots, \lambda_7^{(\text{ref})}] =$ [12.3, 17.4, 20.5, 7.3, 6.0, 6.0 and 7.3 Å].

Setting RC zones and selective-sampling technique

We defined the RC zones for λ_1 and λ_2 according to Supplementary subsection 10 and Table S3. The zones for λ_3 were related to those for λ_1 , as shown in Eq. S18. Those for the other RCs [$\lambda_4, \dots, \lambda_7$] were

set by Eq. S19–S22. To maintain the ET1 structure, we set nvs(i) = 1and $\Delta \lambda_1^{(i)} = 1$ Å (i = 4, ..., 7).

Furthermore, the selective-sampling technique eliminated some less-interesting conformations from sampling (Supplementary subsections 11 and 12). The ET1 orientation was maintained approximately as in the native complex structure. However, as described later, the ET1 orientational fluctuations were large. The selective sampling worked substantially only when ET1 was outside the binding pocket of hETB.

The original mD-VcMD method was proposed assuming that the zone width is constant (Hayami *et al.*, 2018; Higo *et al.*, 2017a,b). In this study, however, the width is variable (Table S3). Therefore, we modified the sampling method to adjust the variable zone width (Supplementary subsection 13).

Canonical distribution function

The canonical distribution function at 300 K is useful to analyze the sampled snapshots. We present a method to derive the function from mD-VcMD in Supplementary subsection 14.

Conventional canonical MD starting from completely dissociative state

As explained later, mD-VcMD demonstrated an attractive interaction between ET1 and hETB even when ET1 was outside the binding pocket of hETB. To confirm this result, we applied conventional canonical MD. Although the canonical MD has lower sampling efficiency than mD-VcMD, it can sample ET1 motions well outside the binding pocket. In mD-VcMD, furthermore, selective sampling restricted the ET1 orientational motions outside the binding pocket. Consequently, the canonical MD was used to compensate ET1 motions outside the binding pocket obtained from mD-VcMD.

We picked 1088 conformations from snapshots sampled by mD-VcMD, of which ET1-hETB distance λ_1 was in a range 64.5 Å $\leq \lambda_1 \leq 65.0$ Å, where ET1 was dissociated completely from hETB. Next, we performed conventional canonical MD runs at 300 K starting from the 1088 conformations for 1.0 ns (1.088 μs in total) with confining λ_1 in a narrow range 64 Å $\leq \lambda_1 \leq 65$ Å, allowing $[\lambda_2, \dots, \lambda_7]$ to move freely. As a result, the ET1 orientation was randomized sufficiently in this narrow λ_1 range (data not shown). Then, 1088 canonical MD runs of 5 ns (5.44 μs in total) were performed at 300 K allowing all RCs to move freely. Resultant 1088 sub-trajectories from 4 to 5 ns (1.088 μs in total) were used for analyses. We infer that this canonical simulation was sufficiently long because the attractive interaction was reproduced, as described later.

Results and Discussion

Virtual state-partitioned probability

The current mD-VcMD comprised 76 iterations, the last iteration of which was the production run. Each iteration consisted of 2168 runs. The production run (2.6 μs in total) was used for analyses. Actual simulation lengths of the iterations are listed in Table S4.

Only a single state was set for each of $[\lambda_4, \dots, \lambda_7]$ (i.e. nvs(i) = 1; $i = 4, \dots, 7$). Therefore, we omitted $[L_4, \dots, L_7]$ in expression of Q_{entire} as $Q_{\text{entire}}(L_1, L_2, L_3) = Q_{\text{entire}}(L_1, L_2, L_3, 1, 1, 1, 1)$. Furthermore, because the selective sampling allowed only three states to L_3 at each state of L_1 (Eq. S27 and Fig. S8B), the conformational 301



Fig. 3 Landscape of $Q_{\text{entire}}^{(2D)}$ converted to potential of mean force, PMF, by $-\text{RTln}[Q_{\text{entire}}^{(2D)}(L)]$ (T = 300 K and R is the gas constant). Its value is presented by the color bar. The lowest PMF is set to 0 kcal/mol. The *i*-th and *j*-th virtual states for L_1 and L_2 , respectively, are converted to the λ_1 and λ_2 axis by $\lambda_1 = 0.5 \times \{[z_i^{(1)}]_{\min} + [z_i^{(1)}]_{\max}\}$ and $\lambda_2 = 0.5 \times \{[z_i^{(2)}]_{\min} + [z_i^{(2)}]_{\max}\}$. Numbers labeled near contour lines are PMF values in units of kilocalories per mole.

variety along λ_3 was small. Therefore, we expressed Q_{entire} in a 2D form by integrating Q_{entire} over L_3 as

$$Q_{\text{entire}}^{(\text{2D})}(L_1, L_2) = \sum_{L_3 = L_1 - 1}^{L_3 = L_1 + 1} Q_{\text{entire}}(L_1, L_2, L_3).$$
 2

Figure 3 is the landscape of $Q_{entire}^{(2D)}$ from the production runs, which is sufficiently uniform: the error (deviation from an ideally flat $Q_{entire}^{(2D)}$ defined in Eq. S8) is less than 2 kcal/mol.

Free-energy landscape

We also express Q_{cano} in a 2D form as

$$Q_{\text{cano}}^{(\text{2D})}(L_1, L_2) = \sum_{L_3 = L_1 - 1}^{L_3 = L_1 + 1} Q_{\text{cano}}(L_1, L_2, L_3, 1, 1, 1, 1, 1). \quad 3$$

Figure 4A presents the free-energy landscape at 300 K in the 2D plane, where PMF = $-RT \ln[Q_{cano}^{(2D)}(L_1, L_2)]$. We picked snapshots from some positions labeled *a*, *b*, ... and *l* in the landscape. Fig. 4B portrays those conformations. ET1 was at a native-like position in snapshots *a* and *b*. In snapshots *c* and *d*, ET1 remained in the binding pocket. In snapshots *e* and *f*, ET1 was at the gate of the binding pocket. In snapshots *g* and *h*, ET1 was outside of the binding pocket, whereas ET1 remained contacting some parts of hETB. In snapshots *i* and *j*, ET1 was dissociated from hETB, although ET1 might contact hETB. Finally, in snapshots *k* and *l*, ET1 was dissociated completely from hETB with no contacts.

Here we introduce a notation $R[r_{low}; r_{up}]$ to express a λ_1 range of $r_{low} \leq \lambda_1 \leq r_{up}$, where the unit of r_{low} and r_{up} is angstrom. In Fig. 4A, the free-energy elevation along λ_1 was apparently steep in R[14; 20], where ET1 was in the binding pocket. Then, the freeenergy elevation calmed for $\lambda_1 > 20$ Å. This range involves snapshots e and $f(\lambda_1 = 30$ Å), where ET1 was at the gate of the binding pocket.

To show the free-energy variation more clearly, we introduced a 1D PMF, PMF^(1D), by projecting $Q_{\text{cano}}(L_1, L_2)$ in the L_1 axis. The detailed expression is presented in Supplementary subsection 15.



Fig. 4 (A) Free-energy landscape expressed by PMF = $-RTln[Q_{cano}^{2DD}(L)]$ (T = 300 K). Virtual states L_1 and L_2 are converted to λ_1 and λ_2 , as presented in the caption of Fig. 3. The lowest PMF is set to 0 kcal/mol. Numbers labeled near contour liners are their PMF values in units of kilocalories per mole. Conformations taken from positions labeled *a*, *b*, ... and *l* are displayed in panel (B). Values $[\lambda_1, \lambda_2]$ are coordinates of the labels in angstrom units. (B) Snapshots taken from labeled positions in panel (A). Each of labels *a*, *b*, *c*, and *d* involves two snapshots, where magenta ET1 and blue hETB construct one snapshot, and yellow ET1 and cyan hETB constitute the other. Two snapshots are displayed for each of *e*, *f*, *g*, and *h* differently to clarify the structural variety. Three snapshots are shown for each label of *i*, *j*, *k*, and *l*.

Fig. 5 depicts $PMF^{(1D)}(L_1; C_k)$ as a function of λ_1 . This figure shows again that the free-energy elevation was steep in R[14; 20]. We designate this λ_1 range as a *binding pocket range*. For $\lambda_1 > 20$ Å, the mean force acting on ET1 from surrounding became weak, and ET1 at $\lambda_1 = 30$ Å was at the gate of binding pocket (snapshots *e* and *f*). Then, we name R[20; 30] as a *gate range*. In R[30; 50], ET1 was outside of the binding pocket, although PMF^(1D) still increased slowly with increasing λ_1 . ET1 contacted hETB in a fraction of snapshots as shown in snapshots *g*, *h*, *i*, and *j*. We name R[30; 50]an *outside-gate range*. For $\lambda_1 > 50$ Å, PMF^(1D) was almost flat; ET1-hETB contacts were seldom formed. Therefore, the mean force acting on ET1 from surrounding was almost canceled out. In fact, ET1 was completely dissociated from hETB. We designate this range as a *completely dissociative range*. Fig. S10 summarizes these ranges.

The inset of Fig. 5 presents an illustration of $PMF^{(1D)}(L_1; C_k)$, which indicates that ET1 can have a path through the open state of the binding gate more readily than through the closed state: $\Delta PMF^{(1D)}(L_1) = PMF^{(1D)}(L_1; C_{open}) - PMF^{(1D)}(L_1; C_{closed}) \approx$ -4.5 kcal/mol in the λ_1 range of the inset. The probability for the open state is approximately 2000 times greater than that for the closed state. This result indicates that adoption of λ_2 was effective for enhancing sampling. The $\Delta PMF^{(1D)}$ in the binding pocket range was also negative, whereas $\Delta PMF^{(1D)}$ was smaller than that in the gate range.



Fig. 5 PMF^(1D)(L_1 ; C_k) (k = closed, middle, open) as function of λ_1 . The x-axis, which is virtual state L_1 originally, is converted to λ_1 . The conversion method is given in the caption of Fig. 3. Inset is a part of PMF^(1D) to present differences among C_{closed} , C_{middle} , and C_{open} .

Fly-casting from mD-VcMD

As shown above, ET1 contacted hETB, even in the outside-gate range. Viewing snapshots in this range, we noticed that ET1 tends to contact three hETB segments: the N-terminal (residues 85-89), a hairpin (residues 241-256), and/or a helix-turn-helix (residues 344-366). We, respectively, denote these segments as Seg_{Ntm}, Seg_{hpn}, and Seg_{HTH} (see Fig. 6). They were highly fluctuating in the simulation. Especially, Seg_{Ntm} was disordered. Seg_{Ntm} was also disordered in crystallography (PDB ID: 5glh). Cys 90 is disulfide-bonding with Cys 358 in hETB. Therefore, the positional fluctuations of Cys 90 were small. Therefore, we did not involve this residue to Seg_{Ntm}.

Next, we calculated the heavy-atomic minimum distance between ET1 and each segment for all snapshots. We denote the distances as $d_{\text{ET1-Seg}X}^{\min}$ ($X \in \text{Ntm}, \text{hpn}, \text{HTH}$), and assigned a contact to a snapshot if $d_{\text{ET1-Seg}X}^{\min} \leq 5$ Å. Fig. 7A indicates that most of the contacts were from ET1 – Seg_{Ntm} for $\lambda_1 > 45$ Å. For $\lambda_1 \leq 45$ Å, ET1 – Seg_{hpn} and ET1 – Seg_{HTH}, contacts also appeared. Consequently, the ET1 – Seg_X contacts were commonplace in the gate-outside range R[30; 50]. Fig. 7A also shows that the ET1 – Seg_{Ntm} contacts appeared even in R[50; 55], which is a part of the completely dissociative range (Fig. S10). However, this contact was minor; non-contacting snapshots were major.

To analyze the ET1 – Seg_{Ntm} contacts further, we calculated a probability distribution of $d_{\rm ET1-Seg_{Ntm}}^{\rm min}$ in $R[r_{\rm low}; r_{\rm up}]$: $p(d_{\rm ET1-Seg_{Ntm}}^{\rm min})$. Supplementary subsection 16 explains the method of calculating the distribution. Fig. 8A presents a free-energy basin at $d_{\rm ET1-Seg_{Ntm}}^{\rm min} \approx 4$ Å except for R[55; 65]. A significantly strong attractive force acted between ET1 and Seg_{Ntm} in the outside-gate range.

This interaction mechanism should be categorized as a fly-casting mechanism (Arai, 2018; Shoemaker *et al.*, 2000; Sugase *et al.*, 2007), where a disordered protein (or segment) binds weakly and non-specifically to its binding partner. In the present system, once ET1 is captured by the disordered segment Seg_{Ntm}, ET1 remains around the binding pocket. Therefore, the local ET1 concentration is raised around the binding pocket even if the concentration is low in the whole solution. Without the disordered tail, hETB cannot capture ET1 from a distant place. The genuine N-terminal of hETB is much longer than the truncated form (Seg_{Ntm}) in the present simulation. Furthermore, the actual long N-terminal tail might assist the ET1–hETB interactions for longer range ($\lambda_1 > 65$ Å). Later, we discuss the fly-casting mechanism for GPCR-ligand interactions.



Fig. 6 Three segments Scg_{Ntm} (red ribbon), Scg_{hpn} (green), and Scg_{HTH} (blue). Residue numbers for segments are given in text. Solid lines show the minimum distances $d_{ETI-Seg_X}^{min}$. Broken-line rectangle with label S–S denotes a disulfide bond between Cys 90 and Cys 358.

Fly-casting from canonical MD

The canonical MD sampled conformations in the completely dissociative and outside-gate ranges. We plot $d_{\text{ET1-Seg}_{Ntm}}^{\min}$ calculated from the 1088 canonical MD runs (1.088 μ s in total) along the λ_1 axis (Fig. 7B), which showed again that most of the contacts were from ET1 – Seg_{Ntm} for $\lambda_1 > 45$ Å. Comparing Fig. 7B with Fig. 7A, the canonical MD provided a broader distribution than mD-VcMD did at each λ_1 . This difference is because of the effect of selective sampling used in mD-VcMD, that is, the conventional MD could sample the completely dissociative and outside-gate ranges freely without the restraint on the ET1 orientation. Later, the selective sampling is discussed again.

Figure 8B portrays $PMF(d_{ET1-Seg_{Ntm}}^{min})$ from the canonical MD, which also presents the free-energy basin at $d_{ET1-Seg_{Ntm}}^{min} \approx 4$ Å. We conclude that the complex formation was initiated by the fly-casting mechanism.

Variety of intermolecular contacts in the fly-casting mechanism

Here, we analyze the ET1 – Seg_{Ntm} contact in R[45;55] further because this contact was dominant in this range for both simulations (Fig. 7). Four out of five residue sequence of Seg_{Ntm}



Fig. 7 Distributions of $d_{\text{ETI}-\text{Seg}_X}^{\text{ini}}$ as function of λ_1 from (A) mD-VcMD and (B) canonical MD, where λ_1 is 11.6–65.0 Å.

(sequence: ISPPP) are hydrophobic, whereas ET1 (sequence: CSC-SSLMDKECVYFCHLDIIW) involves hydrophobic and hydrophilic residues almost equally.

We gathered snapshots involving ET1 – Seg_{Ntm} contacts in R[45; 55]. Given a snapshot, if the ET1 – Seg_{Ntm} contact was formed by hydrophobic residues (A, I, L, V, G, P, W, F, and M) of ET1 and Seg_{Ntm}, then we judged that this contact was hydrophobic. If it was formed by hydrophilic ones (D, E, K, H, R, T, N, S, Q, Y, and C), then the contact was hydrophilic. The other contacts (i.e. contact between hydrophobic and hydrophilic residues) were assigned as intermediate.

The intermediate-contact fractions were 47.4 and 55.5%. The hydrophobic-contact ones were 42.8 and 40.4%, and the hydrophilic-contact ones were, respectively, 9.8 and 4.1% for mD-VcMD and the canonical MD. Therefore, the largest, second largest, and smallest fractions were, respectively, intermediate, hydrophobic, and hydrophilic commonly whether the selective sampling was used or not. The smallest fraction assigned to the hydrophilic contact results from the small content percentage of hydrophilic residues in Seg_{Ntm}.

Figure 9A and 9B, respectively, portray snapshots in R[45; 55] from mD-VcMD and canonical MD. From surveying many snapshots in this range, we found that Ile 85 of hETB (the first amino acid residue of Seg_{Ntm}) participated frequently in the ET1 – Seg_{Ntm} contact in both simulations. Contrarily, residues in ET1 had no specificity. Residues labeled in Fig. 9 are those participating in the ET1 – Seg_{Ntm} contact. It is a particularly interesting finding that the contacting residues formed a hydrophobic cluster frequently. This hydrophobic cluster formation occurs readily because Ile 85 of hETB can reach the farthest range from hETB in the currently computed system, and because isoleucine has a long hydrophobic sidechain. Therefore, the hydrophobic cluster tends to be formed first. Met 7 and Lys 9 of ET1 labeled in Fig. 9B are hydrophilic. The stems of

these residues are hydrophobic, to which the sidechain of Ile 85 of hETB contacted.

Remember that we removed the long N-terminal tail of hETB in the simulation. This tail is disordered in the full-length hETB because the crystallography did not provide the coordinates for the tail. It is also likely that the fly-casting mechanism in the full-length hETB is exerted more effectively than that in the truncated hETB because the disordered long tail can search a longer range around hETB.

Orientations of ET1 relative to hETB

5

To analyze the effects of selective sampling (Eq. S26) directly, we introduced a scalar product for each snapshot as

$$S_{\rm ori} = e_{\rm ET1} \cdot e_{\rm hETB},$$
4

where e_{hETB} and e_{ET1} are unit vectors defined, respectively, in ET1 and hETB (Fig. S11). In principle, S_{ori} ranges between -1 and +1. If e_{hETB} and e_{ET1} are completely parallel, then $S_{ori} = +1$. If completely antiparallel, then $S_{ori} = -1$.

Figure 10A depicts scattering of S_{ori} from mD-VcMD along λ_1 , where S_{ori} seldom descended below -0.5 in R[30; 65]. This pattern was created by the selective sampling because S_{ori} was not distributed in the full range from -1 to +1, even in the completely dissociative range R[50; 65]. In contrast, S_{ori} from the canonical MD was distributed widely and uniformly in the full range for $\lambda_1 > 30$ Å (Fig. 10B). Because the ET1–hETB interaction becomes weaker with increasing λ_1 for $\lambda_1 > 30$ Å, it is likely that the canonical MD provided a canonical-like distribution for $\lambda_1 > 30$ Å. Remember that the elimination of zones (L_{elm} in Eq. S26) in mD-VcMD does not affect the distribution assigned to the sampled zones. Therefore, the canonical MD compensates mD-VcMD in R[30; 65]: that is, the sampled region in mD-VcMD is a part of that in the canonical MD for $\lambda_1 > 30$ Å, although the canonical MD could not sample regions for $\lambda_1 \leq 30$ Å.

In the gate range R[20; 30], the S_{ori} scattering from mD-VcMD decreased concomitantly with decreasing λ_1 (Fig. 10A). This decrement occurs because the gate acted on ET1 as an orientational restraint: The selective sampling less affected the ET1 orientation in this range because the lower boundary of the S_{ori} distribution in R[20; 30] was apparently larger than that in R[30; 65].

By contrast, the S_{ori} scattering from the canonical MD remained wide in the gate range, although the scattering was considerably sparse (Fig. 10B). Actually, λ_1 proceeded rarely below 30 Å in the canonical MD. Therefore, we confirmed again that the binding pocket gate is located at $\lambda_1 \approx 30$ Å. It is likely that the gate-width is so narrow orientationally that ET1 cannot fit the gate readily, and that once ET1 fits the gate orientationally, the S_{ori} scattering becomes narrower with decreasing λ_1 up to 20 Å, as presented in Fig. 10A. This result can be rationalized to define the gate range at R[20; 30].

In mD-VcMD the distribution width of S_{ori} did not vary in R[14; 20], although the position of distribution moved. Therefore, ET1 goes a narrow pathway in the binding pocket to reach the genuine binding form. This range correlates well with the range of the steep free-energy variation in Fig. 5.

Fig. 4A showed no narrow pathway. The ET1–hETB binding/unbinding process can occur via various means in the λ_1 - λ_2 plane. As shown in our earlier study (Kamiya *et al.*, 2002), a visual impression of the free-energy landscape depends strongly on the coordinate axes to view the landscape. Although λ_2 worked effectively for enhancing sampling, another parameter S_{ori} provided a better view



 $\textbf{Fig. 8} \text{ PMF}(d_{\text{ET1-Seg}_{NTm}}^{\min}) \text{ as a function of } d_{\text{ET1-Seg}_{NTm}}^{\min} \text{ in five ranges of } R[r_{\text{low}};r_{\text{up}}] \text{ computed from (A) mD-VcMD and (B) canonical MD.}$



Fig. 9 Three snapshots with ET1 – Scg_{Ntm} contact in R[45;55] taken from (A) mD-VcMD and (B) canonical MD. ET1 is in magenta, and hETB in cyan. The right panels are superpositions of the three snapshots. A residue ordinal number X in hETB and ET1 is labeled as AX and BX, respectively.

to analyze the binding process. The conformational distribution can be constructed in any conformational space once the mD-VcMD sampling is completed.

Multiple contact capture mechanism

With decreasing λ_1 , other contacts than the ET1 – Seg_{Ntm} one appeared. We analyzed these contacts as follows: Given a snapshot, if all the three minimum distances $d_{\text{ET1-Seg}_X}^{\min}$ ($X \in \text{Ntm}, \text{hpn}, \text{HTH}$) were smaller than 5 Å, then we judged that this snapshot had three

contacts. If two, one, or none of the distances were smaller than 5 Å, then two, one, or no contacts were assigned, respectively, to the snapshot. Then, we calculated a fraction in $R[r_{\text{low}}; r_{\text{up}}]$: $f(k) = N(k) / \sum_{j=0}^{3} N(j)$, where N(k) is the number of snapshots with k contacts ($k = 0, \dots, 3$) in $R[r_{\text{low}}; r_{\text{up}}]$.

Figure 11A presents the fractions calculated from mD-VcMD. In R[55;65], $f(0) \approx 1.0$ and $f(k) \approx 0.0$ ($k \ge 1$). Then, f(0) decreased monotonically with decreasing λ_1 . Instead, f(1) increased rapidly in R[45;55] exhibiting the fly-casting mechanism, and reached the maximum in R[40;45]. Subsequently, f(1) decreased quickly in R[35;40],



Fig. 10 Distribution of S_{ori} (Eq. 4) as a function of λ_1 computed from (A) mD-VcMD and (B) canonical MD.

where f(2) reached the maximum. Then, f(2) decreased rapidly in R[30; 35] because f(3) grew quickly in this range. The large f(3) in R[30; 35] indicates naturally that ET1 contacted all three segments to fit in the binding pocket gate because the gate is constructed by the three segments.

In the canonical MD (Fig. 11B), f(0) was also close to 1.0 inR[55;65]. The other fractions increased gradually with decreasing λ_1 . However, those fractions did not show the maximum. To fit the gate at $\lambda_1 \approx 30$ Å, ET1 should contact all the three segments as shown in Fig. 11A. As reported earlier, λ_1 rarely proceeded below 30 Å (Fig. 9B). Probably, the orientational disorder of ET1 hindered the three-contact formation. Consequently, ET1 could not penetrate into the binding pocket.

To assess relation between the ET1 orientation and the molecular binding, we picked snapshots randomly from $R[r_{low}; r_{up}]$ and displayed them in Fig. S12. In R[30; 35], ET1 stayed around the binding pocket gate in both simulations. However, the ET1 orientational variety differed greatly between the two simulations. In mD-VcMD (Fig. S12A), ET1 was able to penetrate among the three segments to move to the gate and binding pocket ranges smoothly by virtue of the convenient ET1 orientation. In the canonical MD (Fig. S12B), by contrast, ET1 was caught at the gate because of the inconvenient molecular orientation of ET1. This point is discussed further later.

Disordered long tail of GPCRs

The cysteine residue at the root of Seg_{Ntm} (Cys 90 for hETB), which is conserved in many GPCRs, forms a disulfide bond with a cysteine residue at the N-terminal side of the transmembrane helix 7. The genuine N-terminal tail is long and disordered in many GPCRs (Wallin and von Heijne, 1995). Based on results of the present study, we infer that the long tail captures a ligand before the ligand reaches the binding pocket of GPCR.

The fly-casting mechanism is related to conformational disorder. The conformational disorder can be assigned to either receptor or ligand. The ligand examined in the present study is well structured. The disordered segment of the receptor captures the ligand. A similar fly-casting mechanism was proposed from NMR spectroscopy of another GPCR–ligand complex formation (Kofuku *et al.*, 2009), where a long N-terminal tail of GPCR captures its ligand at an early stage of molecular binding, although there are some differences in the binding process between the two systems.

One might consider that the disordered segment should be folded in the final complex form as shown in the coupled folding and binding mechanism (Higo *et al.*, 2011; Sugase *et al.*, 2007). However, Fig. S12A proposes a different scenario: the figure panels for R[10; 15], R[15; 20], and R[20; 25] show that Seg_{Ntm} is disordered again. Consequently, Seg_{Ntm} works only in the early stage of the ET1–hETB complex formation. This computational result is supported by the result of crystallographic analysis, where Seg_{Ntm} is disordered in the complex structure (PDB ID: 5glh), in which the structure of residues 85–87 are not determined.

IDP or intrinsically disordered region (IDR) was discovered from NMR spectroscopy (Wright and Dyson, 1999); the fly-casting mechanism was proposed as an IDP/IDR-related interaction mechanism using a coarse-grained protein model (Shoemaker *et al.*, 2000). Additionally, the conformation-selection and induced-folding (Spolar and Record, 1994) mechanisms are likely to occur in IDP-related interactions. A wide survey (Arai, 2018; Mollica *et al.*, 2016) of NMR spectroscopy and transient kinetic techniques revealed that these interaction mechanisms take place in a mixed manner depending on the system. Results of the present study show that the fly-casting occurred first and that conformation-selection occurred second in the interaction between GPCR and its ligand. Our earlier study (Higo *et al.*, 2011) also showed that conformation-selection and induced-folding take place in a complicated and mixed manner.

Conformational selection at the binding pocket gate of hETB

Decrease of the ET1 orientational variety began at the binding pocket gate ($\lambda_1 \approx 30$ Å) in mD-VcMD (Fig. 10A). Fig. 10B showed that the random orientation of ET1 is inconvenient for ET1 to fit into the gate. Consequently, it is likely that convenient orientations of ET1 are selected from the random orientations to proceed further in the binding process. Generally, this selection mechanism is categorized in *conformational selection* (or *population shift*) (Bosshard, 2001; James and Tawfik, 2003; Yamane *et al.*, 2010).

We examined an additional 64 conventional MD runs (13.2 μ s in all) starting from conformations picked from snapshots of mD-VcMD in *R*[30; 35], which are slightly outside the gate. Those conformations had convenient orientations for molecular binding because they were taken from mD-VcMD. As a result, half of 64 runs moved into the binding pocket, and two runs reached native-like complex forms (data not shown). These results suggest that the ET1 orientation is fundamentally important to fit into the gate. Of course, this simulation does not prove the conformational-selection mechanism firmly. If MD runs are performed for a sufficiently long time starting from random orientations of ET1, then we can confirm the conformational-selection mechanism.

Several points to be improved in the current study

The free-energy difference between the genuine complex structure and the completely dissociated conformations were about 200 kcal/mol (Fig. 5). Reported values of the dissociation constants for complexes of endothelins and their receptors are 1-100 pM in order of magnitude (Hilal-Dandan et al., 1997; Mey et al., 2009; Takasuka et al., 1994). The free-energy differences estimated from these values are about 14-17 kcal/mol. Therefore, the computed free-energy difference is considerably larger than the experimental ones. We infer that the method to update $Q_{cano}^{[M]}$ from $Q_{cano}^{[M-1]}$ and $Q_{entire}^{[M]}$ (i.e. Eq. S11) might be inaccurate to treat the complicated system. Our earlier work (Higo et al., 2017a) (1D virtual-system coupled Monte-Carlo sampling) presented two equations (Eqs. 4.1 and 4.2 of the article) to update Qcano: Eq. 4.1 is fundamentally the same as the present work; actually, Eq. 4.2 is another equation that is suitable for sampling a complicated system or performing non-equilibrium sampling.



Fig. 11 (A) Fraction f(k) at five ranges of $R[r_{low}; r_{up}]$ from (A) mD-VcMD and (B) canonical MD.

Preliminary simulations (Supplementary subsection 9) revealed that ET1 unfolds occasionally in the binding pocket. Consequently, in the present study, we introduced $[\lambda_4, \dots, \lambda_7]$ to maintain the tertiary structure of ET1. The free-state ET1 structure from crystallography (Janes *et al.*, 1994) (PDB ID: 1edn) and that from NMR (Takashima *et al.*, 2004) (PDB ID: 1v6r) differ in their details. However, both structures consist of an α -helix and an extended strand, between which two disulfide bonds are formed. This overall structural feature of the free ET1 is similar to the bound form used in the present work. We have no information for the transient ET1 structure in the binding pocket. If ET1 unfolds in the binding pocket, then RCs $[\lambda_4, \dots, \lambda_7]$ should be modulated to control unfolding and refolding of ET1.

Conclusion

We computed the ET1–hETB free-energy landscape and investigated the ET1–hETB contacts and the ET1 orientations of the sampled snapshots. We classified the ET1–hETB distance (λ_1) into five ranges. In the outside-gate range, the attractive interaction (the fly-casting mechanism) acted between the two molecules, where the disordered N-terminal segment of hETB played an important role. The attractive interaction was confirmed using a conventional simulation method: canonical MD. The present study also suggested the existence of a conformational-selection mechanism, which works at the gate range to select ET1 convenient for transporting ET1 into the binding pocket.

Supplementary Data

Supplementary data are available at *Protein Engineering*, *Design and Selection* online.

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