



# Biosynthesis of eriodictyol in citrus waster by endowing P450BM3 activity of naringenin hydroxylation

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## Abstract

The flavonoid naringenin is abundantly present in pomelo peels, and the unprocessed naringenin in wastes is not friendly for the environment once discarded directly. Fortunately, the hydroxylated product of eriodictyol from naringenin exhibits remarkable antioxidant and anticancer properties. The P450s was suggested promising for the bioconversion of the flavonoids, but less naturally existed P450s show hydroxylation activity to C3' of the naringenin. By well analyzing the catalytic mechanism and the conformations of the naringenin in P450, we proposed that the intermediate Cmpd I ((porphyrin) Fe=O) is more reasonable as key conformation for the hydrolyzation, and the distance between C3'/C5' of naringenin to the O atom of Cmpd I determines the hydroxylating activity for the naringenin. Thus, the “flying kite model” that gradually drags the C-H bond of the substrate to the O atom of Cmpd I was put forward for rational design. With ab initio design, we successfully endowed the self-sufficient P450-BM3 hydroxylic activity to naringenin and obtained mutant M5-5, with  $k_{cat}$ ,  $K_m$ , and  $k_{cat}/K_m$  values of 230.45 min<sup>-1</sup>, 310.48 μM, and 0.742 min<sup>-1</sup> μM<sup>-1</sup>, respectively. Furthermore, the mutant M4186 was screened with  $k_{cat}/K_m$  of 4.28-fold highly improved than the reported M13. The M4186 also exhibited 62.57% yield of eriodictyol, more suitable for the industrial application. This study provided a theoretical guide for the rational design of P450s to the nonnative compounds.

## Key points

- The compound I is proposed as the starting point for the rational design of the P450BM3
- “Flying kite model” is proposed based on the distance between O of Cmpd I and C3'/C5' of naringenin
- Mutant M15-5 with 1.6-fold of activity than M13 was obtained by ab initio modification

**Keywords** Naringenin · Eriodictyol · P450BM3 · Flying kite model

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## Introduction

The reprocessing of agricultural waste has always been a significant concern, as it could improve the product additional value and protect the environment (Khan et al. 2021;

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Sharma and Lee 2017). However, the compounds of steroids (Acevedo-Rocha et al. 2018; Kille and Reetz 2011; Li and Reetz 2020), alkanes (Chen and Cong 2019; Karasawa and Watanabe 2018), and flavonoids (Chu and Sohng 2016; Hong and Kong 2020; Nguyen and Yun 2020a, b, 2021) that widely exist in agricultural waste are hard to be converted into high-valued pharmaceutical molecules. Naringenin is a kind of flavonoid in citrus waste (Sharma and Lee 2017), and its hydroxylated product eriodictyol was an effective medicine with properties of anti-cancer (Chu and Sohng 2016), anti-inflammatory (Lee and Kim 2013), anti-apoptotic, and antioxidant (Lee and Cho 2007). The eriodictyol was also widely used as precursor in the synthesis of taxifolin, proanthocyanidins, anthocyanins (Owens and Winkel 2008), and silibinin (Lv and Zhou 2019). In 1999, Kaltenbach and Schröder (1999) achieved eriodictyol biosynthesis by co-expression of flavonoid hydroxylase P450 (F3'H) and P450 reductase from *Catharanthus roseus* in *Escherichia coli*. However, both the expression and selective activity of the recombinant protein were poor. In 2010, Amor and Ghouil (2010) obtained a high yield of 200 mg/L for eriodictyol by expressing bioflavonoid 3'hydroxylase (F3'H) from gerberas, but the activity of these plant-derived F3'H/CPRs was decreased significantly once being expressed in yeast. Despite the several achievements in eriodictyol synthesis with different P450s (Amor and Ghouil 2010; Kaltenbach and Schröder 1999; Kasai and Sakaki 2009), challenges like low expression and insufficient activity remain.

P450BM3 (CYP102A1), derived from *Bacillus macros*, possesses advantages of self-sufficiency, highly solubility, high hydroxylation activity, and broad substrate spectrum (Whitehouse and Wong 2012). Also, the P450BM3 and its mutants have great potential towards in hydroxylating steroids (Acevedo-Rocha et al. 2018; Kille and Reetz 2011; Li and Reetz 2020), alkanes (Chen and Cong 2019; Karasawa and Watanabe 2018), flavonoids, and their derivatives (Chu and Sohng 2016; Hong and Kong 2020; Nguyen and Yun 2020a, b, 2021). Kille and Reetz (2011) and Li and Reetz (2020) and Chen and Wong (2020) have achieved specifically stereoselective hydroxylation of steroids like testosterone, androstenedione (AD), dehydroepiandrosterone (DHEA), and testosterone (TST) via P450BM3 modification. In 2016, Chu and Sohng (2016) obtained two mutants of M13 and M15 by modifying the inactive P450BM3 and successfully converted naringin into eriodictyol, providing a new clue for eriodictyol biosynthesis. However, the activities of M13 and M15 are very low. Detailed structural analysis and better design strategy for the rational design are necessarily needed to obtain mutants with high activity. Due to the indeterminacy of the core catalytic model, rational design efforts for eriodictyol in P450BM3 are unproductive, less mutants with highly active reported thus far. The catalytic mechanism of P450 has been demonstrated to involve

a nine-step cycle; however, consensus on which step is more reasonable for rational design has not yet reached. Given the consistent presence of iron-porphyrin in reported P450 structures, it has commonly served as the starting point for molecular modifications. Sun and Li (2020) and Hong and Kong (2020) utilized iron-porphyrin as the starting point and successfully developed mutants with high hydroxylation activity to steroids. However, the intermediates of porphyrin-Fe<sup>III</sup>-OOH (Cmpd 0), porphyrin-Fe<sup>IV</sup>=O (Cmpd I), and porphyrin-Fe<sup>IV</sup>-OH (Cmpd II) were highly involved the catalyzation, compared to iron-porphyrin. Moreover, the formation of compound I (Cmpd I, porphyrin (Fe=O) was considered the limit step in the hydroxylation (Huang and Groves 2017; Sligar 2010). Thus, the starting structure for the rational design needs further analysis.

In this paper, the Cmpd I is proposed more reasonable as the starting structure than Fe-porphyrin for the rational design of P450BM3. Additionally, a “flying kite model” is put forward based on the distance between the oxygen atom of Cmpd I and the hydroxylated site C3'/C5' of naringenin. By gradually dragging naringenin closer to the oxygen atom of Cmpd I, two mutants, M4186 and M5-5, were respectively obtained. This ab initio design approach for P450BM3 offers valuable guides for endowing enzymes activity towards novel substrates, thereby expanding their potential applications in industry and pharmacy.

## Material and methods

### Plasmids, microorganisms, and media

The P450BM3 gene (NCBI: CP001982.1) was cloned in the plasmid pET28a. The constructed plasmid P450BM3-pET-28a was used as template to construct mutants M13, M4186, and M5-5 using a point mutation system with the primers in Table S2. Mutagenesis was performed using the Blunting Kination kit. Subsequently, the modified plasmids were transformed and replicated into competent *E. coli* DH5 $\alpha$  cells. Competent *E. coli* BL21 (DE3) cells were used as expression hosts and transferred using the heat shock method (Liu et al. 2021). Colony PCR was employed for the validation of successful transformation, while DNA sequencing was utilized for the identification of mutants.

### Protein expression and purification of mutants

The colonies were picked and grown in 5 mL of Luria–Bertani medium containing kanamycin (50  $\mu$ g/mL), and incubated overnight in a shaker at 37 °C and 220 rpm. The cultured cells were then inoculated in 500 mL of LB medium with kanamycin (50  $\mu$ g/mL) at a 1% v/v ratio. Isopropyl- $\beta$ -D-thiolaldehyde glycoside (0.5 mM) and 5-aminolevulinic

hydrochloride (1.0 mM) were added to the medium for enzyme induction when the OD<sub>600</sub> reached between 0.6 and 0.8. The cells were incubated for 12 h at 20 °C/220 rpm and harvested via centrifugation for 5 min at 8000 rpm and 4 °C. The cells were resuspended in buffer A (50 mM Tris-HCl, 100 mM NaCl, 10% glycerol, pH 7.4) and washed three times. Afterwards, the cells were resuspended in Buffer A at a ratio of 1 g cells/7 mL and sonicated for 40 min in an ice bath using a 5 s:5 s sonication:pause interval. The cell fragments were centrifuged at 18,000 g for 20 min at 4 °C, and the supernatant was filtered through a 0.22- $\mu$ m Millipore filter. The obtained supernatant was purified using Ni affinity chromatography and validated with SDS-PAGE (Fig. S1). Protein concentrations were quantified via Bradford method with bovine serum albumin as the standard.

### Enzymatic activity assay and kinetic measurements

The 500- $\mu$ L volume of reaction is catalyzed in potassium phosphate buffer (100 mM, 10% glycerol, pH 7.4). The composition of the reaction was as follows: 1  $\mu$ M purified P450 BM3, 0.1 mM naringenin, 5 mM glucose, 1 mM NADP<sup>+</sup> and GDH crude enzyme. After incubating for 2 h at 37 °C, the reaction was terminated by adding 1 mL methanol and was shake for another 10 min. The terminated reaction solution was centrifuged at a speed of 20,000 g for 20 min. The supernatant was collected and subjected to high performance liquid chromatography-photodiode array (HPLC-PDA) for further analysis. The kinetic parameters of the mutants were determined by quantifying different concentrations of naringenin. The experimental data were fitted to the Michaelis-Menten kinetic model to obtain the kinetic parameters (Nguyen et al. 2021; Nguyen and Yun 2021).

### Whole cell biotransformation of naringenin

The colony was cultured in 5 mL of LB medium containing kanamycin (50  $\mu$ g/mL), and were then incubated in a shaker at 37 °C and 220 rpm for roughly 8 h. Subsequently, 200  $\mu$ L of the inoculate was transferred to a 250-mL flask containing 50 mL of 1  $\times$  M9 medium with kanamycin (50  $\mu$ g/m). Once the OD<sub>600</sub> reached 0.8–1.0, 0.5 mM IPTG and 1 mM 5-aminolevulinic acid were added to induce the protein expression. The cells were incubated at 22 °C and 200 rpm for another 12 h. Naringenin dissolved in dimethyl sulfoxide (DMSO) was added to the culture at a final concentration of 100  $\mu$ M and further incubated at 28 °C. Samples were collected periodically using aliquots of 1 mL, which were subsequently subjected to centrifugation and freeze-drying processes. The resulting freeze-dried samples were reconstituted using methanol (1 mL), followed by centrifugation at 20,000 g for 20 min prior to analysis via HPLC-PDA.

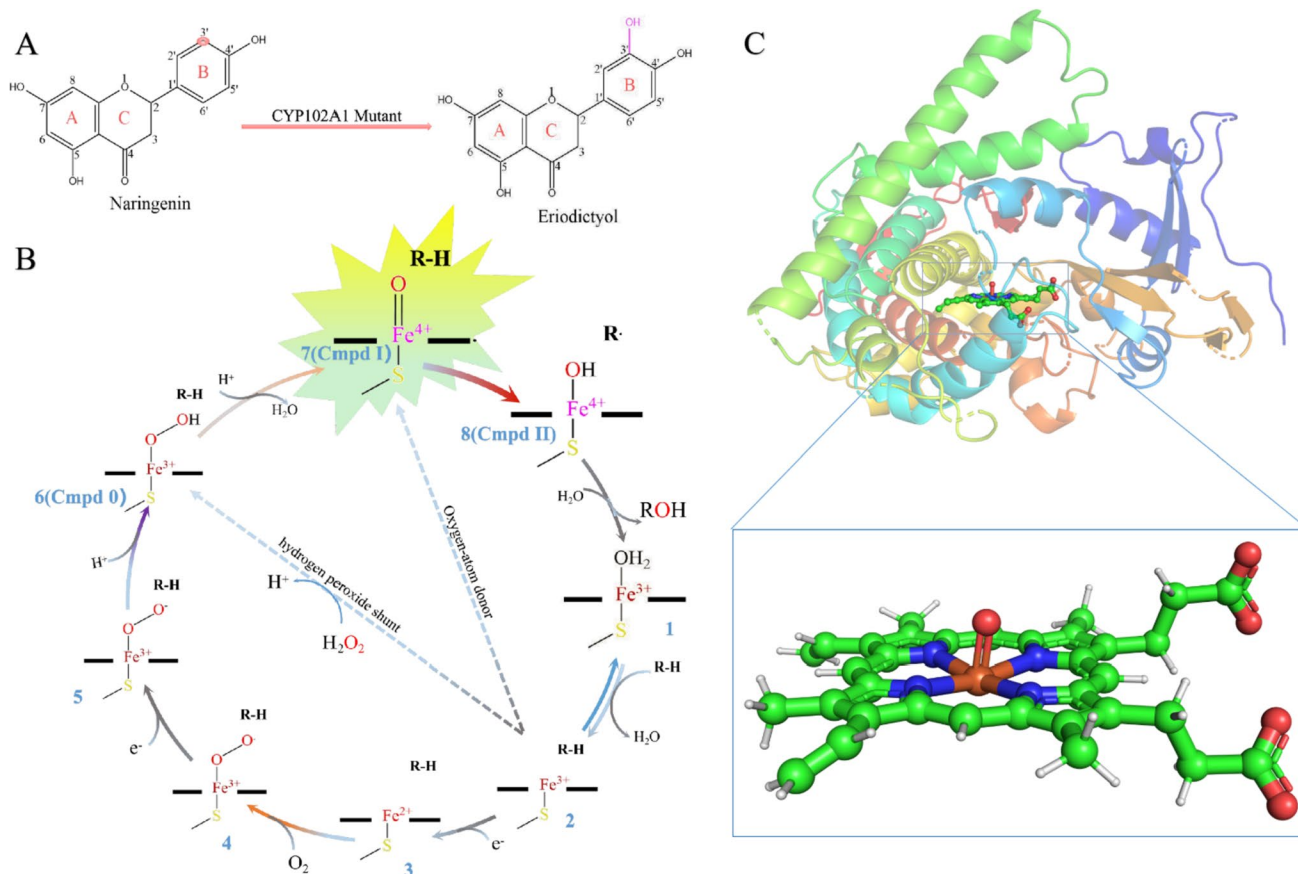
### Molecular docking and MD simulations

The heme domain of P450BM3 (PDB: 1BU7) was downloaded from the database <https://www.rcsb.org/> and imported into the Maestro program after removing water molecules. The iron porphyrin was isolated, and an oxygen atom was added to the Fe<sup>2+</sup> of the iron porphyrin using the Draw option, with a set Fe=O bond length of 1.65 Å. This constructed Cmpd I was then used to replace the iron porphyrin in 1BU7 using the Discovery Studio 2019 software for subsequent simulation and design. The complexed structure of the heme domain with Cmpd I underwent minimization before molecular docking of naringenin using Maestro program. The overall geometry optimization was performed with OPLS3e, setting the O atom of Cmpd I as the docking center within a box size of 20Å  $\times$  20Å  $\times$  20Å. The ligand of naringenin was first prepared at pH 7.0  $\pm$  2.0 using LigPrep and was then docked into active site of the built structure using the program of Docking module with standard precision (SP). The top ten conformations were collected and all structures were visually analyzed using the DS program.

## Results

### The catalytic core model for the near-attack state

The key factor in converting naringenin into eriodictyol for P450BM3 is to place the nonnatural ligand at a specific conformation with an optimal catalytic distance (Fig. 1A). However, there is still challenge how to precisely define this catalytic distance. Extensive studies have elucidated that the hydroxylation mechanism of P450BM3 involves nine steps, with multiple reduction and oxidation reactions (Fig. 1B). However, it is still not determined whether the popherin-Fe<sup>2+</sup> or Cmpd I is more reasonable as the starting point for P450-BM3 modification. At present, most P450 modification was conducted by (1) blind direct/saturation mutagenesis and (2) substrate conformation-focused mutagenesis, with ferroporphyrin as the starting structure. Herein, we attention to the bio-catalyzation (proton/electron transfer) to determine the starting structure and define the catalytic distance. In P450BM3, snatching the H $\cdot$  from the substrate by Cmpd I (step7, Fig. 1B) was the step directly involved in the hydroxylation and eriodictyol synthesis. Thus, the Cmpd I was proposed more reasonable as the starting point for the rational design compared to the other intermediates of iron porphyrin, ferroporphyrin-OOH, or iron porphyrin-OO<sup>-</sup> synthesized in the catalytic cycle (Jiang and Li 2021; Ogliaro and Shaik 2002; Su and Shaik 2019; Wang and Shaik 2015). The distance between the O atom of Cmpd I and the C3' atom of the naringenin determines the catalytic activity and stereo-selectivity. In 2010, Rittle and



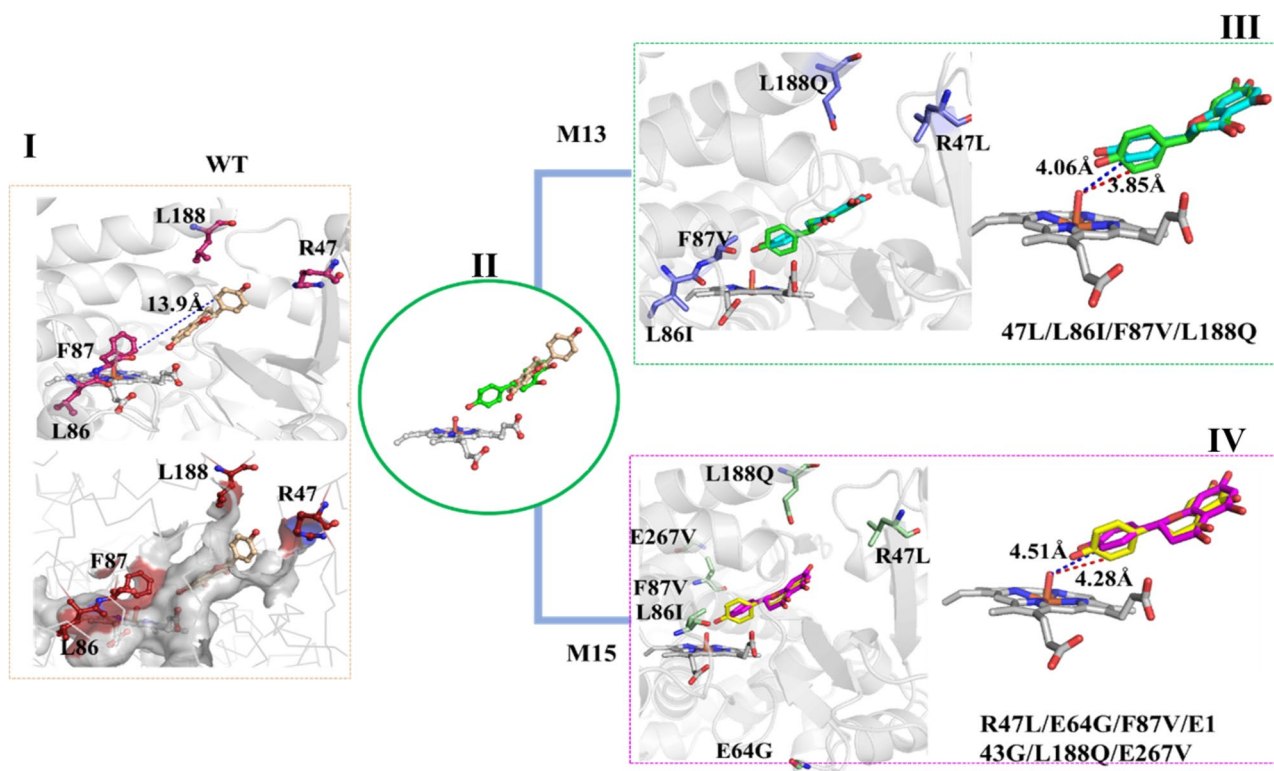
**Fig. 1** **A** P450 BM3 mutants catalyzed regioselective hydroxylation of naringenin to produce eriodictyol. **B** The catalytic mechanism cycle for the hydroxylation of P450. **C** Catalytic intermediate (Cmpd I) model for the rational design put forward in this paper

Green Michael (2010) captured the P450 (CYP119)-Cmpd I complex and determined the  $\text{Fe}=\text{O}$  bond to be  $1.68\text{\AA}$  by low temperature crystallization. Therefore, we were able to obtain the structure of Cmpd I in the heme domain (PDB ID: 1BU7) by constructing  $\text{Fe}=\text{O}$  bonds on porphyrin-Fe (Fig. 1C), and analyzed the relationship and influence of the distance between the O atom of Cmpd I and the C3'/C5' atom of the substrate B ring on the catalytic activity and selectivity.

We identified the influence factors of hydroxylation activity, through the analysis of naringenin in WT, M13 (R47L/L86I/F87V/L188Q), and M15 (R47L/E64G/F87V/E143G/L188Q/E267V) active center of conformational change. As shown in Fig. 2I, the A ring of naringenin in WT is close to the Cmpd I, causing the hydroxylation site C3' on the B ring extremely far away from the active O atom ( $13.9\text{\AA}$ ). In contrast, the R47L, F87V, and L188Q mutations in M13 and M15 provided additional substrate space and allowed naringenin to flip  $180^\circ$ , causing the B ring stretching deep into the catalytic site. The farther distance caused by the incorrect conformation in the active site of the wide P450BM3 is believed to be the main barrier for its catalytic activity to

naringenin. It is of note that the naringenin in both M13 and M15 was stretched in two conformations at the B ring, both parallel and perpendicular to the porphyrin. The distance between the C3' of both the parallel and vertical naringenin and the O atom of Cmpd I in M15 was  $4.51$  and  $4.28\text{\AA}$ , respectively (Fig. 2II; Fig. S2), whereas those in M13 were  $4.06$  and  $3.85\text{\AA}$  (Fig. 2III). The closer catalytic distance of M13 than M15 suggested a better hydroxylation activity, which was consistent with the experimental observations: M13 showed higher naringenin-hydroxylating activity than M15 (Chu and Sohng 2016).

With precondition of correct stretching manners of the naringenin in the active site, shorter distances between the catalytic atoms of the ligand and Compound I could highly improve the hydroxylation activity. Therefore, in rational design, we treated the substrate as a kite and tried to improve the catalytic activity by constantly dragging the C3'/C5' of naringenin closer to the Compound I O atom of Cmpd I. In each round of screening, the mutant with the nearest catalytic distance and minimum binding energy was picked for experimental verification. We call this design strategy as "flying kite model" (Fig. 3A).



**Fig. 2** Binding state of the substrates in the P450 BM3(I), M13 (II), and M15 (III). I, the ligand naringenin flipped away in the active pocket of wide type P450BM3, and the distance of catalytic site C3' of and the O atom of the Cmpd I is 13.9 Å. II and III, the ligand in M13 and M15 stretched correctly with the B ring close to Cmpd I. There were parallel and vertical conformations of naringenin in

M13 (green and cyan sticks) and M15 (magenta and yellow sticks), and the corresponding distances were respectively 4.06/3.85 Å and 4.51/4.28 Å. The residues in the WT, M13, and M15 were respectively shown as red, slate and lemon sticks. And the Cmpd I was shown as grey sticks

### Modification of M13 using the “flying kite model”

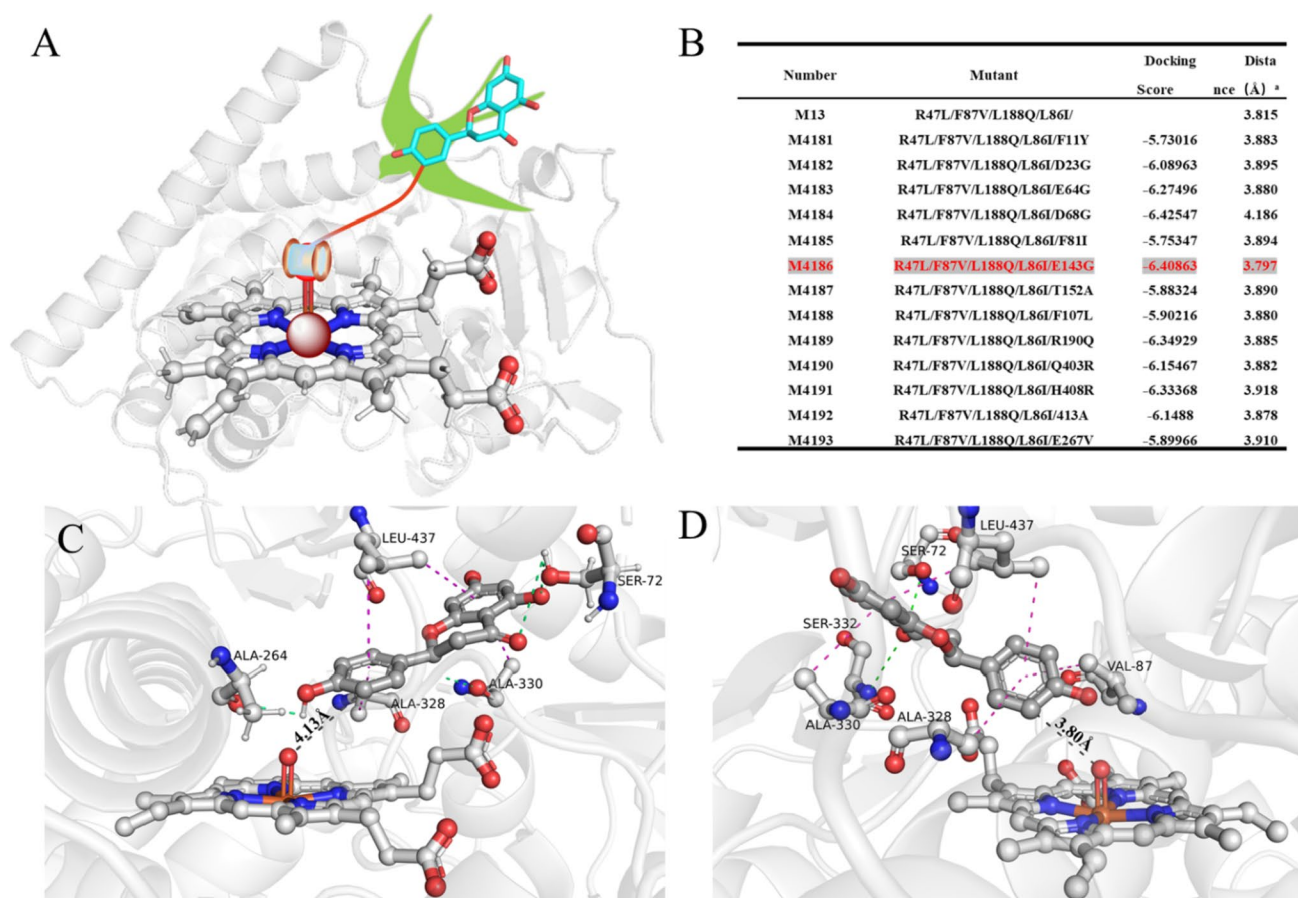
Based on the above “flying kite model,” we utilized M13 with the highest activity as the starting point for mutation design. We selected residues within 20 Å range in the active pocket (Fig. 3B; Table S3), which are known to be involved in flavonoid catalysis (Table S1), for mutagenesis. Thirteen of these residues were used for mutation design, and naringenin had vertical and parallel conformations in these mutants. However, except for mutant M4186, all mutants exhibited longer distances between their catalytic atoms (C3' of naringenin and O of Cmpd I) compared to M13's distance of 3.82 Å. The catalytic distances in mutant M4186 were measured at 4.13 and 3.80 Å, respectively (Fig. 3C and D). The construction of M4186 was therefore picked for experimental verification. The total turnover number (TTN, nmol product/nmol enzyme) of M4186 is 86.4, 2.32 times higher than that of M13 (37.2) (Fig. 5A and B). The dynamic parameters of  $K_m$  and  $k_{cat}$  to the naringenin were respectively  $182.339 \pm 23.369 \mu\text{M}$  and  $389.79 \pm 15.4 \text{ min}^{-1}$ , also suggesting a better improvement of ligand specificity and catalytic effectivity

than the wide type M13 ( $479.745 \pm 103.448 \mu\text{M}$  and  $215.83 \pm 21.04 \text{ min}^{-1}$ , respectively) (Table 1).

### Ab initio design of P450BM3 with “flying kite model”

As the “kite model” was putted forward based on the key catalytic step of P450BM3, we propose that this model is not only applicable to M13 but also suitable for designing P450BM3 from scratch. Thus, several rounds of rational designs to the wide type P450BM3 were performed (Table S4).

Dragging the substrate into the binding pocket and maintaining the correct conformation are key steps for P450BM3 to catalyze naringenin (Fig. 2). As shown in Fig. 4 ⊕, in the first round of mutations, the F87V mutant successfully motivated this flipping motion, making the distance between C3'/C5' and the catalytic center Fe=O the shortest (4.16–4.22 Å). The high docking score ( $> -6 \text{ kcal/mol}$ ), closer distance, and reasonable conformation led us to choose F87V as the template for the second round of mutations. The lower catalytic distance (lower



**Fig. 3** **A** The “flying kite model” put forward for the rational design. The distance between the 3' and 5' carbon to the O of the compound I was the key values for the mutagenesis. **B** The docking score and distances of the mutants, and the mutant M4186 was the best one for

the catalyzation. **C** and **D** The binding manners of the parallel and vertical conformation of the substrate naringenin at the active site of M4186. The corresponding residues were shown in sticks, and the van der Waals forces were shown in dashed red and green lines

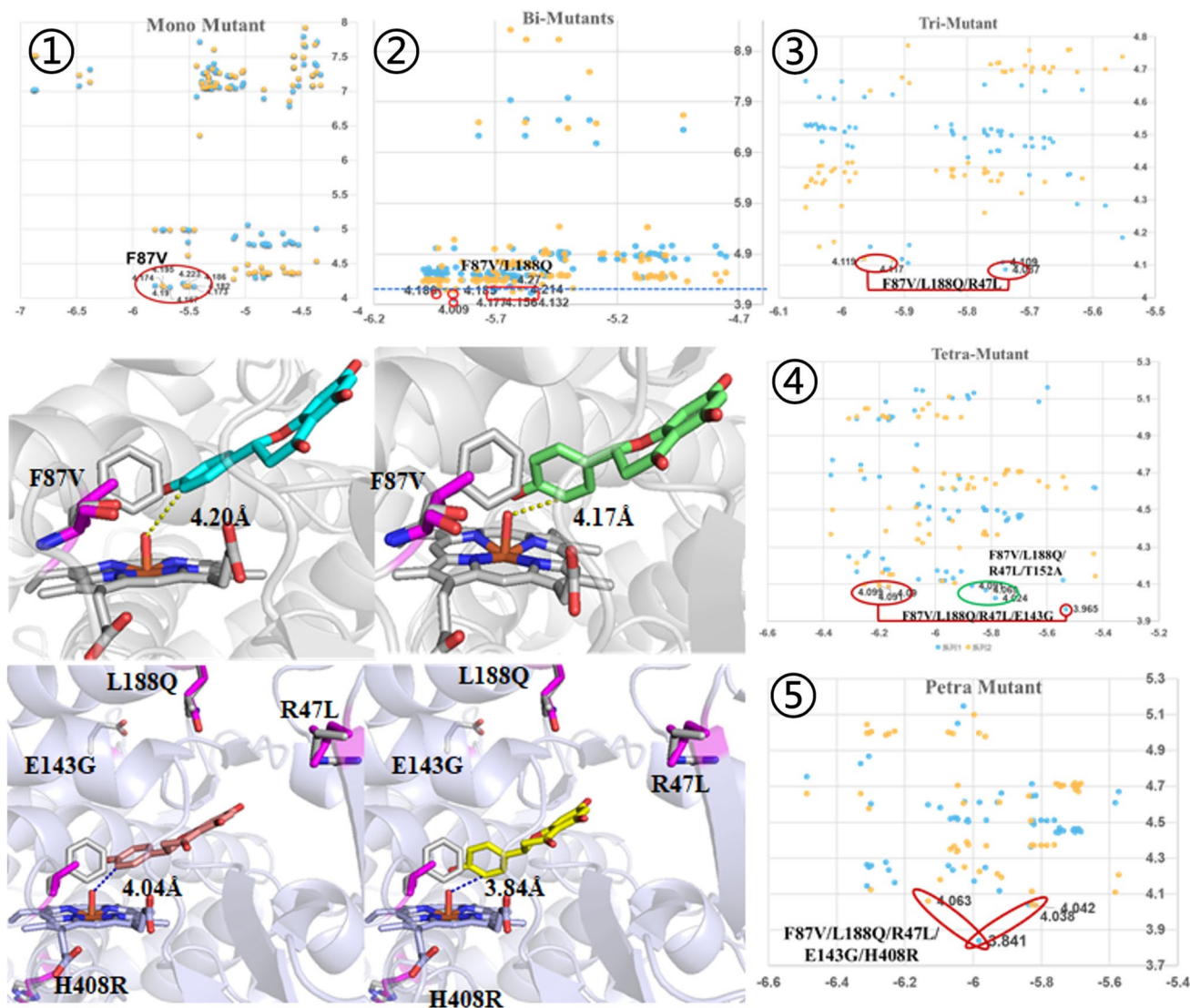
**Table 1** Kinetic parameters of P450BM3 mutants for the hydroxylation of naringenin

Mutant	$k_{cat}$ ( $\text{min}^{-1}$ )	$K_m$ ( $\mu\text{M}$ )	$k_{cat}/K_m$ ( $\text{min}^{-1} \mu\text{M}^{-1}$ )
WT <sup>a</sup>	ND	ND	ND
M13	$215.83 \pm 21.04$	$479.745 \pm 103.448$	0.500
M4186	$389.79 \pm 15.4$	$182.339 \pm 23.369$	2.138
M5-5	$230.45 \pm 20.32$	$310.48 \pm 72.22$	0.742

<sup>a</sup>Incompetence

than 4.9 Å) and docking fraction ( $-5.5 \sim -6$  kcal/mol) in the second round of mutations suggest that it was right to choose F87V as the template. Among all the double mutants, F87V/L188Q performed the best. The distance between Cmpd I and the substrate was 4.13–4.18 Å (Fig. 4 ⊙), while the distance between C5' and reactive oxygen atoms was only 4.13 Å. Consequently, F87V/L188Q was chosen as a template for subsequent design

iterations. In the third and fourth rounds of mutagenesis, F87V/L188Q/R47L and F87V/L188Q/R47L/E143G were obtained as optimal mutants based on their lower catalytic distances and docking scores (Fig. 4 ⊙ and ⊙). However, these mutants selected in the first four rounds shown no hydroxylation activity once constructed in *E. coli* BL21 (DE3), suggesting that these mutagenic efforts were still insufficient to achieve effective hydroxylation. Although there was a slight decrease in the distances between C5'/C3' of the substrate and the O of Cmpd I (4.09–4.12 Å and 4.08–3.97 Å, respectively), as well as four and six close conformations identified in the docking simulation, more significant mutations are required to further shorten catalytic distances to catalyze the naringenin. In the fifth round of mutation, the catalytic distances of M5-5 (F87V/L188Q/R47L/E143G/H408R) were measured to be 4.06 Å (C3') and 3.84 Å (C5') (Fig. 4, ⊙ and II), exhibiting a great catalytic distance decrease of 0.4 Å compared to the F87V mutant (Fig. 4I). This variant was successfully expressed in *E. coli* BL21 (DE3) and displayed favorable catalytic



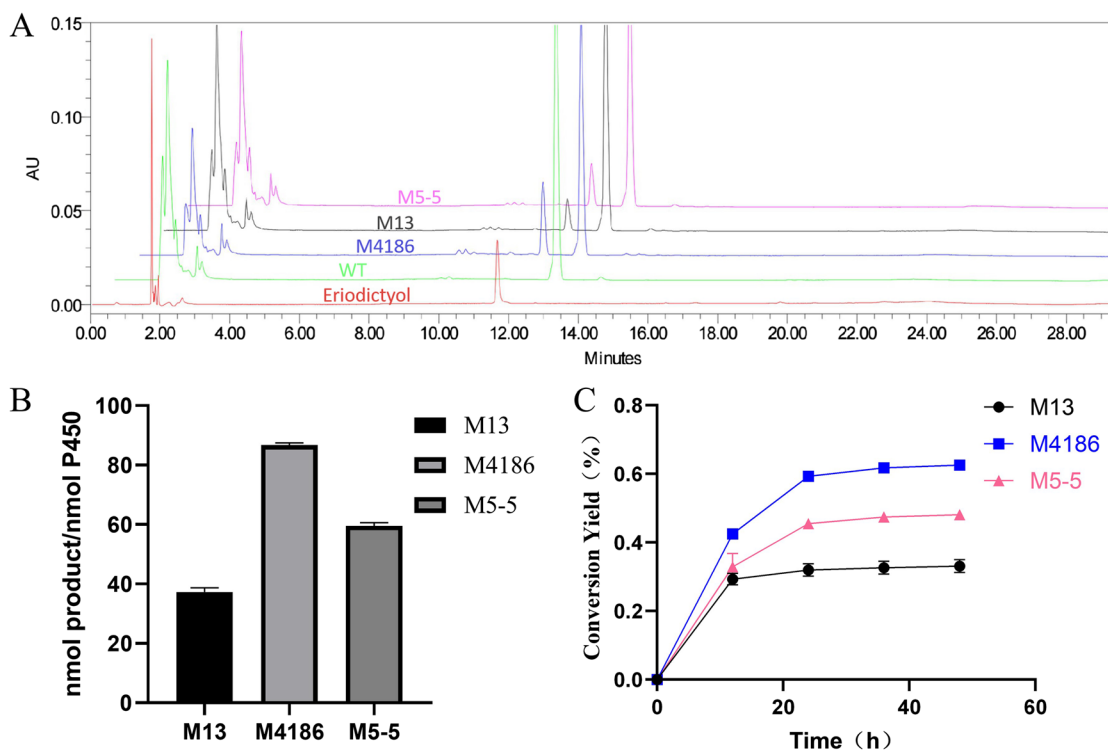
**Fig. 4** Virtual mutagenesis based on the “flying kite model.” ①–⑤ the docking score, distances of 3' and 5' carbon of the substrate with O of the compound I in different mutants. The best mutants were labeled out. I and II, the binding manners of the mono mutant F87V and the petra mutant F87V/L188Q/R47V/E143G/H408R. The initial and

mutated residues were respectively show in gray and magenta sticks. The parallel and vertical stretching manners of naringenin in the two mutants were respectively shown in cyan, lime, salmon, and yellow sticks. And the distances were labeled in Å and shown in dashed yellow and blue lines

activity. The total turnover number (TTN) reached 60, which was approximately 1.6 times higher than that of M13 (Fig. 5A and B). Notably, mutant M5-5 demonstrated comparable dynamic values to M13, with  $k_{cat}$ ,  $K_m$ , and  $k_{cat}/K_m$  values of 230.45 min<sup>-1</sup>, 310.48 μM, and 0.742 min<sup>-1</sup> μM<sup>-1</sup>, respectively. The comparable catalytic distances of M5-5 (4.06 Å and 3.84 Å) to those of M13 (4.06 Å and 3.85 Å) (Table 1; Fig. S2) further support the notion that closer catalytic distances can enhance hydroxylation activity towards nonnatural ligands in mutants. Moreover, the reduced  $K_m$  value observed in M5-5 suggests that improved substrate recognition is a key factor contributing to enhanced hydroxylation performance.

### The biosynthesis of eriodictyol with the mutants

To gain a deeper understanding of the catalytic properties of the M13, M5-5, and M4186 mutants, their catalytic behavior was comprehensively analyzed (Table 1; Figure S3). For the mutant M4186, both of the  $K_m$ ,  $k_{cat}$ , and  $k_{cat}/K_m$  were highly improved than its parent M13 (with one times improved). The mutant M5-5 showed similar  $k_{cat}$  values as M13, with a better improvement in  $K_m$  (310.48 μM), suggesting that it was the higher substrate recognition manner of M5-5 that improved the hydroxylation activity. Considering the catalytic distances of M4186 (4.13 Å and 3.80 Å), M5-5 (4.06 Å and 3.84 Å), M13 (4.06 and 3.85 Å), and their dynamic



**Fig. 5** **A** HPLC-PDA analysis of naringenin in vitro hydroxylation reaction mixture. **B** Total turnover numbers (TTN, nmol product/nmol enzyme) for formation of eriodictyol for the mutants. **C** Biocon-

version rate of naringenin (100 μM) in 50-mL system. The data for the WT, M13, M4186, and M5-5 were respectively colored in green, black, blue and magenta

parameters, it seems that the catalytic distances lower than 3.85 Å could highly possibly endow the P450 activity to naringenin. Furthermore, once these mutants exhibit hydroxylation towards nonnatural ligands, their enhanced recognition abilities can significantly improve overall catalytic efficiency as well. To further investigate the industrial application potential of the mutants, we conducted additional studies on the bioconversion abilities of M13, M4186, and M5-5 in whole-cell catalysis models (Fig. S4). As shown in Fig. 5C, both M4186 and M5-5 exhibited efficient substrate conversion within 24 h, with conversion rates of 60.37% and 42.28%, respectively, significantly higher than that of M13 (36.25%) and almost reached equilibrium. After 48 h of whole-cell catalysis, the naringenin conversion rates catalyzed by M4186 and M5-5 reached 62.57% and 48.12%, respectively — representing a respective increase of approximately 1.89-fold and 1.45-fold compared to that achieved by M13 (36.45%). The closer proximity between naringenin and Cmpd I in mutants such as M4186 and M5-5 (3.80 Å and 3.84 Å) not only confers high catalytic activity but also enhances transformation efficiency. The successful outcomes achieved with M5-5 and M4186 mutants have demonstrated that the “flying kite model,” starting from Cmpd I, is both reasonable and highly practical for the rational design of P450BM3. Reducing the catalytic distance could be a

promising strategy for improving hydroxylation activity of P450 towards other steroids in future research endeavors. Importantly, these mutants exhibited no generation of any other by-products, highlighting their superior potential for industrial applications compared to other P450s. Furthermore, whole-cell catalysis products displayed prolonged survival time and increased stability within pomelo peels compared to enzyme alone, thereby enhancing the value of grapefruit processing.

## Discussion

The steroids, alkanes, and flavonoids are widely present in plants waste, and further treatment of these wastes can improve the added value of products, and effectively avoid the damage to the environment (Acevedo-Rocha et al. 2018; Khan et al. 2021; Kille and Reetz 2011; Li and Reetz 2020; Sharma et al. 2017). Enzyme treatment was prevalent in agriculture processing for their wild catalytic condition (Amor and Ghouli 2010; Kaltenbach and Schröder 1999). However, most enzymes exhibit a limited substrate range. Overcoming this challenge in biochemistry involves expanding their substrate recognition capabilities as well as enhancing their catalytic efficiency towards non-natural complex



compounds (Chu and Sohng 2016; Hyster and Arnold 2015). The P450s have been extensively modified in biochemistry due to their spacious binding pocket and significant potential in medicinal biosynthesis (Kubo et al. 2006; Singh et al. 2015). However, the lack of a clear starting point for rational design has led to ongoing debates regarding strategies for modifying P450BM3, thereby impeding the efficiency of rational design.

In this study, we used Cmpd I as an initial starting point, assuming that a crucial aspect of P450BM3 rational design is to accurately induce ligand stretching manners and reduce the distance between C3'/C5' and the O atom of Cmpd I. Thus, the “flying kite model” was proposed for the biocatalysis of naringenin. By applying the substrate correctly stretching in the binding pocket, we gradually reduced the catalytic distance between C3' and Cmpd I, and obtained M4186 and M5-5 mutants based on M13 and inactivated P450BM3, respectively. The activity of M4186 was 4.27 times higher than that of M13, and the conversion rate of naringenin was 62.57%. These improved catalytic properties made the M4186 more suitable for the waste processing. The activity of M5-5 achieved through the same strategy was 1.48 times higher than that of M13, resulting in a conversion rate of naringenin at 48.12%, which significantly improved the synthesis efficiency of eriodictyol production. As shown in Fig. 3, the mutants of M4186 and M5-5 exhibited almost the same ligand binding manners. In the parallel conformation, the L437 forms  $\pi$  bonds with the B and A ring. In the vertical configuration, the S332 of M4186 forming an additional hydrogen bond with the carbonyl group on the substrate's C ring (Fig. 3). Furthermore, although E143G mutations do not directly participate in ligand binding, they can induce significant polarity and steric changes that may impact the active site size, thereby enhancing substrate affinity towards active Cmpd I (Fig. 4). The consistency of the docking mechanism and experimental data suggests that although the P450 enzyme captures the ligand into its active site through the flexibility of the F/G and B/C loops (Sevrioukova et al. 1999; Tripathi et al. 2013), the relative rigidity and stability of the active site facilitate consistent ligand binding, as observed in our docking simulations, which is a crucial factor contributing to the efficacy of our rational design strategy.

Considering that H $\cdot$  abstraction from substrate by Cmpd I is a crucial catalytic step (Luthra et al. 2011; Mak and Denisov 2018), closer proximity between Cmpd I's oxygen atom and naringenin's C3' carbon would increase the likelihood of mutants exhibiting activity. Based on this mechanism, we propose a “flying kite model” which theoretically applies to non-natural substrates. By gradually positioning the ligand closer to Cmpd I's catalytic center, hydroxylation mutants capable of producing naringenin can be obtained. The successful generation of M5-5 validates the rationale behind

this design strategy. Considering the structure of naringenin with M5-5, M4186, and M13, the catalytic distance of the Cmpd I and the catalytic C atom of the naringenin was suggested to below 3.85 Å. This one-stop modification strategy provides a solid theoretical and practical example for developing P450s for non-substrate compounds. By employing the same model, mutants exhibiting activity towards steroids, alkanes, and flavonoids commonly found in agricultural waste can be feasibly generated, thereby enhancing the additional values of agricultural products.

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**Author contribution** XZ worked on the design of the protocol, experiments, and data analysis. YP helped with the experiments. YF worked on the writing and the visualization. YH and CZ assisted the writing and visualization. BF and JZ helped to design of the protocol. XL helped the computational calculation. BG and LL helped the visualization. HN provided the funding and guide the protocol. LZ provided of the funding, guide the protocol, data, and visualization.

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**Data availability** The data that support the findings of this study are available from the corresponding author upon reasonable request.

## Declarations

**Ethics declarations** This article does not contain any studies with human participants or animals performed by any of the authors.

**Conflict of interest** The authors declare no competing interests.

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