



# Structural and energetic analysis to provide insight residues of CYP2C9, 2C11 and 2E1 involved in valproic acid dehydrogenation selectivity



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## ABSTRACT

Docking and molecular dynamics (MD) simulation have been two computational techniques used to gain insight about the substrate orientation within protein active sites, allowing to identify potential residues involved in the binding and catalytic mechanisms. In this study, both methods were combined to predict the regioselectivity in the binding mode of valproic acid (VPA) on three cytochrome P-450 (CYP) isoforms CYP2C9, CYP2C11, and CYP2E1, which are involved in the biotransformation of VPA yielding reactive hepatotoxic intermediate 2-*n*-propyl-4-pentenoic acid (4*n*VPA). There are experimental data about hydrogen atom abstraction of the C4-position of VPA to yield 4*n*VPA, however, there are not structural evidence about the binding mode of VPA and 4*n*VPA on CYPs. Therefore, the complexes between these CYP isoforms and VPA or 4*n*VPA were studied to explore their differences in binding and energetic stabilization. Docking results showed that VPA and 4*n*VPA are coupled into CYPs binding site in a similar conformation, but it does not explain the VPA hydrogen atom abstraction. On the other hand, MD simulations showed a set of energetic states that reorient VPA at the first ns, then making it susceptible to a dehydrogenation reaction. For 4*n*VPA, multiple binding modes were observed in which the different states could favor either undergo other reaction mechanism or ligand expulsion from the binding site. Otherwise, the energetic and entropic contribution point out a similar behavior for the three CYP complexes, showing as expected a more energetically favorable binding free energy for the complexes between CYPs and VPA than with 4*n*VPA.

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## 1. Introduction

Valproic acid (VPA, Fig. 1) is an important antiepileptic drug that has been widely used in the management of various types of seizure disorders [1]. Although VPA is considered a relatively safe drug, in some occasions, it may associate with severe and sometimes fatal liver injury [2]. Although the mechanism of VPA hepatotoxicity is not understood so far, there are multiple factors that could contribute to the toxicity, including (1) formation of reactive metabolites of VPA [3] and the subsequent

covalent binding to cellular proteins [4–6], and (2) development of oxidative stress [7].

In the course of the characterization of the metabolism of VPA, it was discovered that there were multiple metabolic pathways involved in its biotransformation which give rise to more than 50 known metabolites of the parent drug [8]. However, from these multiple pathways, the oxidative metabolism of VPA by cytochrome P450 (CYP) constitutes a minor metabolic pathway, but it represents the one which generates the hepatotoxic metabolite 2-*n*-propyl-4-pentenoic acid (4*n*VPA) in liver microsomes from rats, mice, rabbits and humans [9]. Experiments using deuterated analogs of VPA to obtain evidence about the dehydrogenation reaction demonstrated that this reaction proceeds via hydrogen atom abstraction of the C4-position [9]. The metabolism of VPA to 4*n*VPA represents a dehydrogenation reaction of a sp<sup>3</sup> hybridized center, which is not adjacent to any sp<sup>2</sup> hybridized carbon center. The metabolite arises by either abstraction of a second hydrogen atom by the Fe(IV)–OH intermediate and subsequent collapse of the diradical or via abstraction of an electron and deprotonation

**Abbreviations:** CYP, cytochrome P-450; CYP2C9, cytochrome P-450 C9; CYP2C11, cytochrome P-450 C11; CYP2E1, cytochrome P-450 E1; MD, molecular dynamics; MM-GBSA, molecular mechanics generalized born surface area; PDB, protein data bank; RMSD, root mean square deviation; 3D, three-dimensional; VPA, valproic acid; 4*n*VPA, 2-*n*-propyl-4-pentenoic acid; VMD, visual molecular dynamics.

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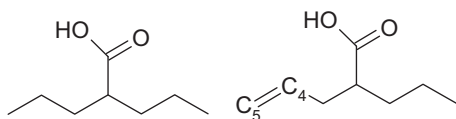


Fig. 1. Chemical structures of VPA (left) and 4nVPA (right).

of the cationic intermediate to yield the alkene [10,11]. However, although this kind of biochemical reaction is unusual in nature; there are several cases where this reaction has been observed [10–16].

CYP is a superfamily of cysteinato-heme enzymes [10,17]. Its active site contains a heme, which is deeply buried inside the protein at the bottom of a large, internal binding cavity. Heme unit consists of an iron protoporphyrin IX complex with a cysteine (Cys) residue as the proximal axial ligand. The active catalytic species, with a Fe(IV)-oxo moiety, is commonly denoted as Compound I. These enzymes are potent oxidants involved in oxidizing reactions such as the hydroxylation of saturated carbon-hydrogen bonds, the epoxidation of double bonds, the oxidation of heteroatoms, dealkylation reactions, and oxidations of aromatics using dioxygen to catalyze a great variety of stereospecific and regioselective processes of oxygen insertion into a variety of organic compounds, both of endogenous (such as steroids) and exogenous (xenobiotics) origins [18–23]. Furthermore, CYP enzymes can also catalyze the dehydrogenation of some organic molecules instead of carrying out the oxygenation of the substrate as observed for VPA and other organic molecules [24]. In this manner, CYP converts all the dioxygen into water and generates an olefin, thus exhibiting a mixed function as an oxidase-dehydrogenase enzyme.

The CYP enzymes share common structural characteristics such as a common overall fold despite less than 20% sequence identity across the CYP gene superfamily [23]. In recent years, the elucidation of several complexes of CYP crystal structures has provided further insight into the important structural aspects of these critical interactions, pointing out that steric and electronic parameters of the enzyme active site residues facilitate dehydration or dehydrogenation reactions by positioning the substrate and/or stabilizing transition states [25,26]. On the other hand, although we have a general understanding about how 4nVPA is formed [9], the precise mechanisms or factors that direct dehydrogenation versus oxygenation are not well understood. Because human CYP2C9, CYP2E1 and rat CYP2C11 have been reported as VPA metabolizing in liver microsomes and also involved in 4nVPA formation [27], elucidating the factors that control its dehydrogenation is crucial to the design of analog drugs with reduced risks of metabolic activation.

Molecular models are valuable tools for studying substrate orientation within the CYP active site [28–31]. Nevertheless, the predictive power of these procedures is highly dependent on several factors, such as the accurate of the three-dimensional (3D) structure used as target [32,33] and the force field parameters for accurately determining the interactions between a compound and its target [34]. Bioinformatics methods have been widely used to predict ligand conformation into CYPs binding sites [13,35]. Moore et al. performed docking studies to model the metabolism of raloxifene, a CYP3A4-mediated dehydrogenated substrate [13]. Molecular docking is a method that predicts the binding mode of a ligand to a protein, and has been extensively used in rational design of drug [36–38]. However, some researcher have mentioned that the conformations obtained through docking procedures need to be examined by molecular dynamic (MD) simulations [39,40]. Therefore, in order to propose a plausible binding conformation between VPA or 4nVPA and CYPs that would allow to explain the binding orientation of both ligands into CYPs binding site as to be susceptible to undergo a dehydrogenation reaction, we carried out

automatic molecular docking using AutoDock software. Afterward, the dynamic stability of these complexes conformations were further analyzed using MD simulations, together with binding free energy estimation using the Molecular Mechanics Generalized Born Surface Area (MMGBSA) method.

To develop this study, we utilized two X-ray crystal structures of human beings (CYP2C9 and CYP2E1) and a model from rat (CYP2C11), which was obtained through homology modeling procedures. Structural analysis shows that CYP2C9, CYP2C11, and CYP2E1 share a similar overall folding structure (Fig. 2A), where the substrate binding cavity is formed by similar secondary structure elements: helices I, F, G, and F–G, B–C loops (Fig. 2B). These CYPs structures were chosen because it has been reported that both human enzymes catalyze the dehydrogenation of VPA [41–43], whereas that CYP2C11 is one of the most active and versatile CYP in rat liver microsomes [44–47] and the one used widely in our laboratory to evaluate the VPA metabolism. Thus, in overall our aim in this study is to determine whether or not the dehydrogenation mechanism was consistent among CYP enzymes or differences were possible among the isoforms. Finally, our results demonstrate the utility of these combined techniques in evaluating the intricate interactions between dehydrogenated substrates and CYP enzymes.

## 2. Methods

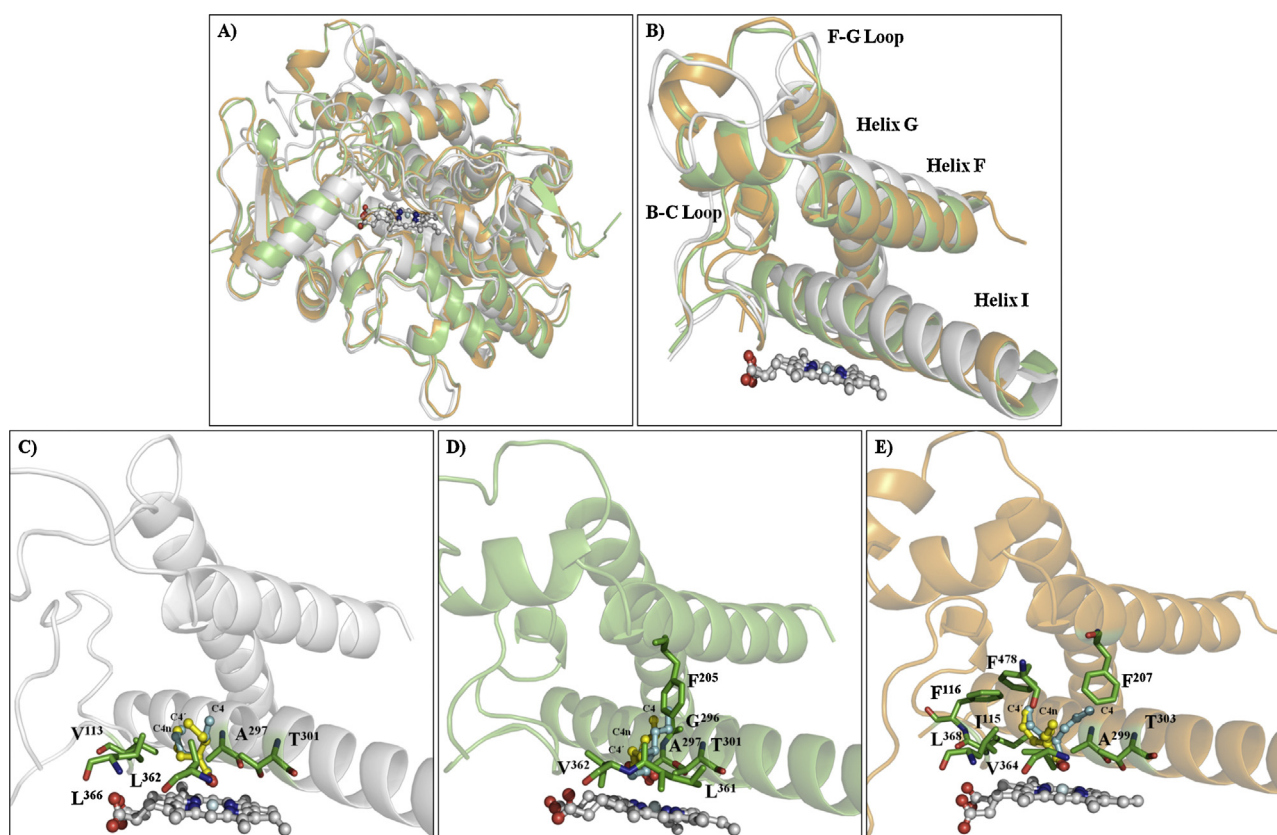
### 2.1. Homology modeling of CYP2C11

Since the crystal structure of CYP2C11 is not available so far in the Protein Data Bank (PDB), the 3D model of CYP2C11 used in the present contribution was constructed based on a homology modeling method using the known 3D structures of CYP2C9 (1R90) and CYP2E1 (3KOH) as templates, and under the following procedure. First, we explored the NCBI protein data base [<http://www.ncbi.nlm.nih.gov/sites/entrez>] to search the amino acid sequences of rat CYP2C11 (Swiss-prot entry code: P08683). The ClustalW program version 2.0 [48] was used to identify similarity of this sequence to other CYP structures, and the I-TASSER server [49] was used to generate the 3D model. Once obtained the latter, this was minimized using MD simulations and its dihedral angles were validated by checking its Ramachandran map. Afterward, a protein sequence alignment among the CYP2C11 sequence, and those of templates (CY2C9 (1R90) and CYP2E1 (3KOH)) was performed using ClustalW program [48] to evaluate the percentage of identity among the three CYP sequences, whereas that the level of conservation for each residue was calculated using PRALINE server [50].

### 2.2. Automated docking

AutoDock version 4.0.1 [51] was used to perform the automated docking studies between VPA or 4nVPA versus CYPs. Both substrates were treated as flexible ligands by modifying their rotatable torsions, but CYP2C9 (Fig. 2C), CYP2C11 and CYP2E1 (Fig. 2D and E) template were considered to be a rigid protein. 3D coordinates of the CYP2C9 and CYP2E1 structures 1R90 and 3KOH, respectively, were acquired from the PDB, whereas CYP2C11 was constructed using homology modeling procedures (see Section 2.1). X-ray structures were cleaned of both water molecules and co-crystallized ligands.

The substrate structures were drawn using the Isis/Draw program [52], and then were converted to a 3D format using WebLab Viewer and Molekel Visualization Package [53,54]. A geometric pre-optimization was carried out by using HyperChem 6.0 [55]. The minimum energy structure of the ligands was obtained using a semi-empirical method at the AM1 level by



**Fig. 2.** Superposition of the overall folding and molecular models of VPA and 4nVPA in the substrate binding site of CYP2C9, CYP2C11, and CYP2E1 predicted by AutoDock version 4.0.1. Folding structures (A) and substrate binding sites (B) of CYP2C9 (white), 2C11 (green), and 2E1 (orange), structures are shown in cartoon representations, and the heme group is represented with white spheres. The RMSD values between CYP2C9 and CYP2C11 or CYP2E1 were 1.692 or 1.578, respectively. VPA or 4nVPA was docked into CYPs, and a representative conformation from the largest and lowest-energy cluster, predicted dehydrogenation from docking between VPA (cyan stick representation) or 4nVPA (yellow stick representation) and CYP2C9 (C); that from docking with CYP2C11 is shown in panel (D), and that from docking with CYP2E1 is depicted in panel (E).

Gaussian 03 [56]. The partial atomic charges (Gasteiger–Marsili formalism) and all rotatable bonds of the ligands as well as the Kollmand charges for all the protein atoms were assigned by AutoDock Tools [51].

To define the binding sites in which the substrates moved, AutoGrid version 3.06 [51] was used. First, rectangular grid boxes were constructed over all proteins (47.798, 34.060 and 54.683 Å<sup>3</sup>, for CYP2C9), (57.950, 57.040 and 57.940 Å<sup>3</sup>, for CYP2C11) and (65.660, 67.520 and 62.560 Å<sup>3</sup>, for CYP2E1) with the grid points separated by 0.375 Å, centered on the ligand binding pocket (upper iron atom at 1.9 Å). The box size was decreased to force the ligands to enter at the active site.

All docking simulations were carried out by using the hybrid Lamarckian Genetic Algorithm, with an initial population of 100 randomly placed individuals and a maximum number of  $1.0 \times 10^7$  energy evaluations. The resulting docked orientations within a root-mean square deviation (RMSD) of 0.5 Å were clustered together. The lowest energy cluster returned by AutoDock for each compound was used for further analysis. All other parameters were maintained at their default settings.

Finally, to determine whether a ligand could be recognized by the proteins, one ligand was first docked following the conditions mentioned earlier, using the box size  $120 \times 120 \times 120$  Å<sup>3</sup>. Then, its coordinates were pasted to proteins PDB structures, obtaining a protein-ligand complex.

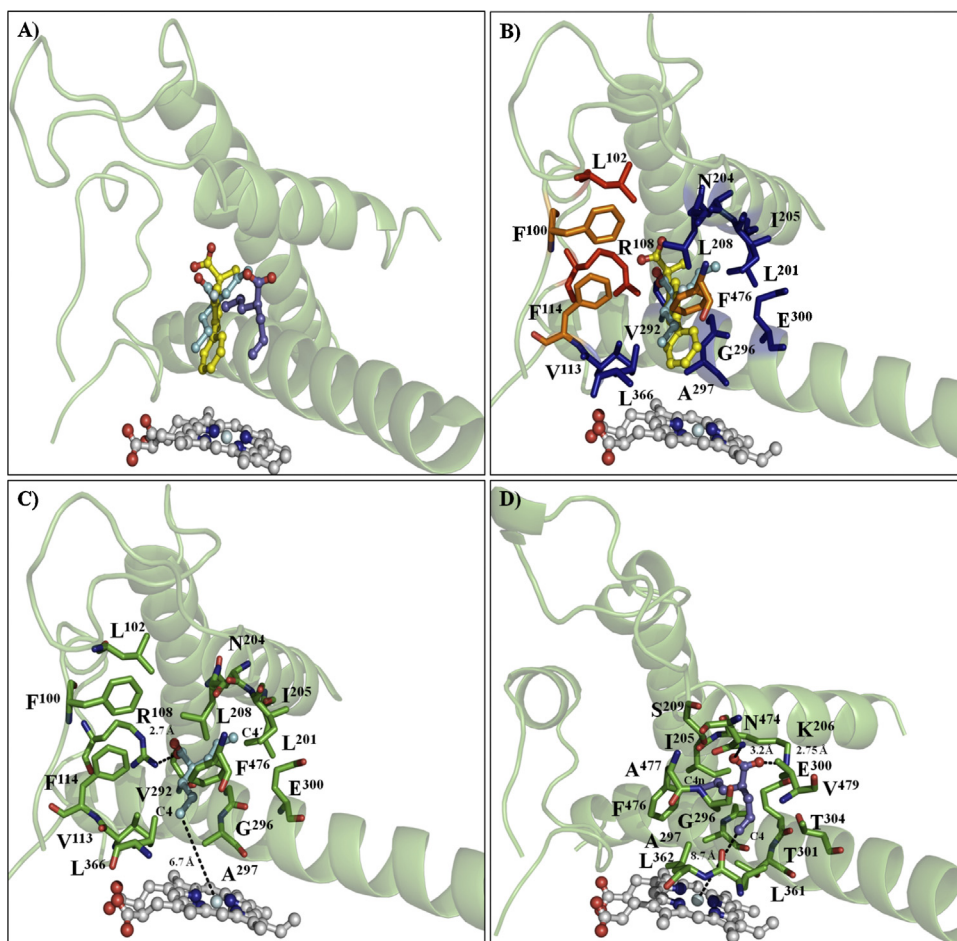
### 2.3. Molecular dynamics (MD) simulations

A series of MD simulations were carried out for all complexes obtained under docking procedures (see Section 2.2). The

simulations and the analysis of the trajectories were performed with Amber 12 package [57] using the FF99SB force field [58]. Complexes were constructed using the Leap module, minimized by the sander module, and the “pmemd” module was used for MD simulations. The ligand parameters were estimated with the antechamber module, based on the general AMBER force field (GAFF) [59], followed by ab initio optimization of ligands at the AM1-BCC level [60]. The missing force field parameters for Heme (all-atom) group were taken from the AMBER parameter database [61]. Cl<sup>-</sup> ions were placed by Leap to neutralize the positive charges of areas around the complex models at pH 7. A rectangular-shaped box of water was constructed using the TIP3P water model [62], with a margin of 12.0 Å in each direction from the solute. The systems were then equilibrated by a 500 ps of energy minimization with position restraints on the protein and ligand to allow for relaxation of the solvent molecules. The equilibration run was followed by a 50 ns MD run without position restraints under periodic boundary conditions.

The non-bonded list was generated using an atom-based cutoff of 8.0 Å. The electrostatic term was described with the particle mesh Ewald algorithm [63]. The time step of the MD simulations was set to 2.0 fs, and the SHAKE algorithm [64] was used to constrain bond lengths at their equilibrium values. Temperature and pressure were maintained using the weak-coupling algorithm [65] with coupling constants  $\tau_T$  and  $\tau_P$  of 1.0 and 0.2 ps, respectively (300 K, 1 atm). Coordinates were saved for analyses every 1 ps. Analysis of the trajectories was performed using AMBER analysis tools [57] and PyMOL [66].





**Fig. 3.** Average conformations of CYP2C9–VPA, CYP2C9–4nVPA complex and the crystallographic structure of the CYP2C9–FLP complex. (A) Structural superposition of the average conformations of CYP2C9–VPA, CYP2C9–4nVPA, and CYP2C9–FLP complex. (B) Residues constituting the hydrophobic cleft (V<sup>113</sup>, L<sup>201</sup>, N<sup>204</sup>, I<sup>205</sup>, L<sup>208</sup>, V<sup>292</sup>, G<sup>296</sup>, A<sup>297</sup>, E<sup>300</sup>, and L<sup>366</sup>), narrow solvent channel (L<sup>102</sup> and R<sup>108</sup>), and the Phe cluster (F<sup>100</sup>, F<sup>114</sup> and F<sup>476</sup>), are rendered as blue, orange and red stick representations, respectively. Residues stabilizing the VPA (C) or 4nVPA (D) conformation within 4 Å are depicted in green stick representation. VPA, 4nVPA, and FLP are shown in cyan, yellow, and blue ball and stick representations, respectively. Oxygen, nitrogen, and FE are colored red, blue, and cyan. For reference, the heme is shown as ball and stick figure colored white, and structural elements building the folding and substrate binding cavity are rendered as cartoon figures. The average conformations were calculated over the final 40-ns of the MD simulations.

### 2.3.1. Calculation of binding free energy

Binding free energies were calculated using MM-GBSA approach supplied with Amber 12 package [57], using a salt concentration of 0.1 M, and the Born implicit solvent model of 2 (igb = 2) [67]. For the CYP2C9–VPA (Fig. 3C) and CYP2C9–4nVPA (Fig. 3D) complexes, the binding free energy was calculated using 400 snapshots of each model at time intervals of 100 ps from the last 40-ns production runs. For the four CYP2C11–VPA conformations present during the last 40-ns of MD simulations, the binding free energies were calculated using 150 snapshots for CYP2C11–VPA<sub>c</sub> (Fig. 4C, 10–25 ns), 50 snapshots CYP2C11–VPA<sub>d–e</sub> (Fig. 4D and E, 25–30 ns), and 200 snapshots CYP2C11–VPA<sub>f</sub> (Fig. 4F, 30–50 ns). From the two CYP2C11–4nVPA conformations present during the last 40-ns of MD simulations, the binding free energy for the most representative conformation was calculated using 350 snapshots (Fig. 4G, 10–45 ns). From the three CYP2E1–VPA (depicting a superposition of VPA and 4nVPA, Fig. 5A and B) conformations present during the MD simulation, the binding free energy for the most representative conformation was calculated using 400 snapshots (Fig. 5C, 10–50 ns). For the CYP2E1–4nVPA conformations showed during the simulation, the binding free energy for the most predominant conformation was estimated using 400 snapshots (Fig. 5G,

10–50 ns). The MM-GBSA method can be conceptually summarized as:

$$\Delta G_{\text{bind}} = \Delta G_{\text{complex}} - \Delta G_{\text{receptor}} - \Delta G_{\text{ligand}} \quad (1)$$

$$\Delta G_{\text{bind}} = \Delta H - T \Delta S \quad (2)$$

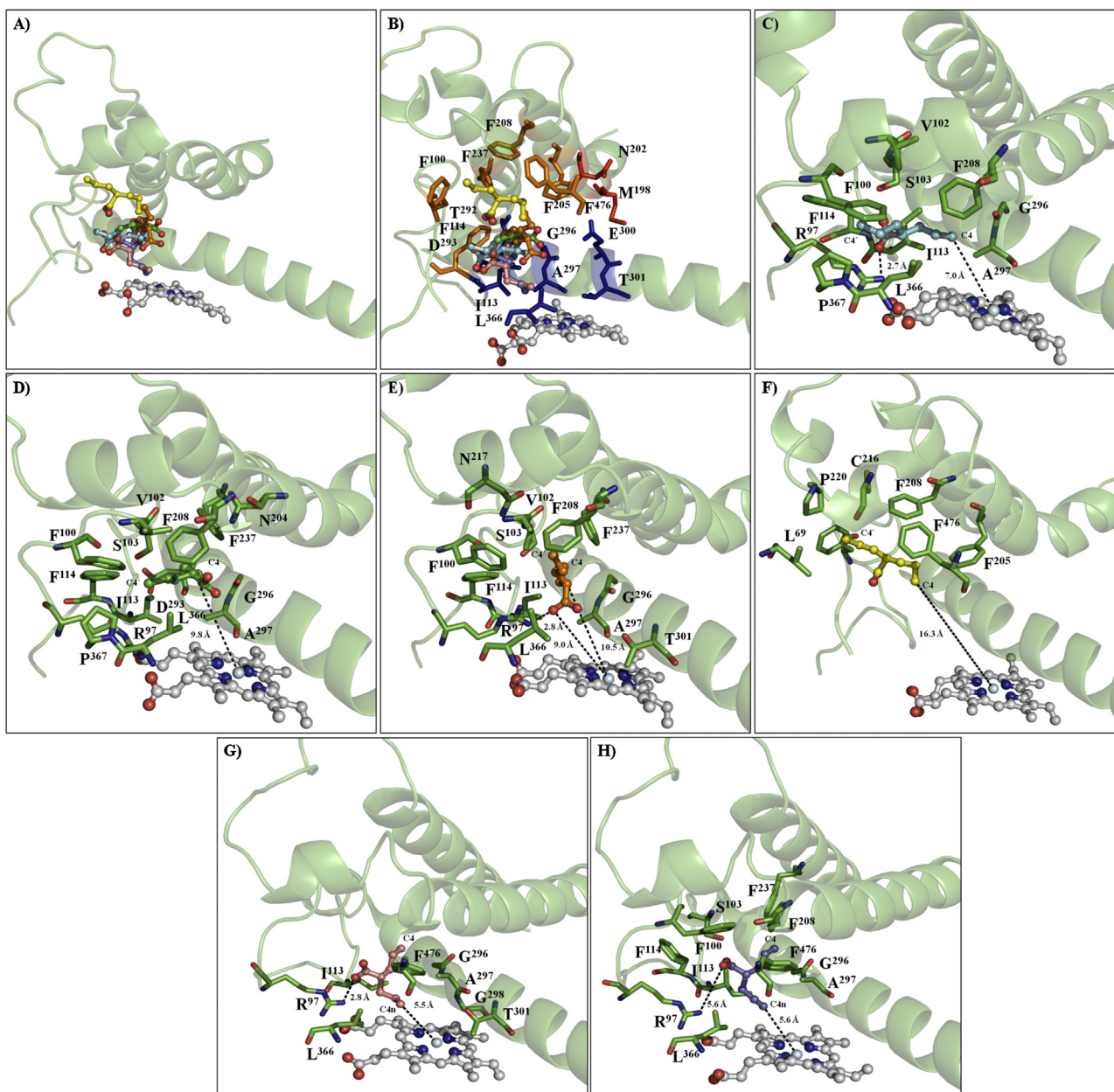
where  $\Delta G_{\text{complex}}$ ,  $\Delta G_{\text{receptor}}$ , and  $\Delta G_{\text{ligand}}$  are the free energies of complex, CYPs and VPA or 4nVPA, respectively.  $\Delta H$  of the system is composed of the enthalpy changes in the gas phase upon complex formation ( $\Delta E_{\text{MM}}$ ) and the solvated free energy contribution ( $\Delta G_{\text{sol}}$ ), while  $-T \Delta S$  refers to the entropy contribution to the binding. Eq. (2) can be then approximated as shown in the following equation:

$$\Delta G_{\text{bind}} = \Delta E_{\text{MM}} + \Delta G_{\text{sol}} - T \Delta S \quad (3)$$

$$\Delta E_{\text{MM}} + \Delta E_{\text{vdw}} + \Delta E_{\text{els}} + \Delta E_{\text{int}} \quad (4)$$

$$\Delta G_{\text{sol}} = \Delta G_{\text{els,sol}} + \Delta G_{\text{nonpolar,sol}} \quad (5)$$

where  $\Delta E_{\text{MM}}$  is the summation of the van der Waals ( $\Delta E_{\text{vdw}}$ ), electrostatic energies ( $\Delta E_{\text{ele}}$ ) and torsional angle energies ( $\Delta E_{\text{int}}$ ).



**Fig. 4.** Average conformations of VPA or 4nVPA into the active site of CYP2C11. (A) Structural superposition of the average conformations of CYP2C11–VPA, and CYP2C11–4nVPA complex. (B) Residues constituting the hydrophobic cleft (I<sup>113</sup>, T<sup>292</sup>, D<sup>293</sup>, G<sup>296</sup>, A<sup>297</sup>, E<sup>300</sup>, T<sup>301</sup>, and L<sup>366</sup>), narrow solvent channel (N<sup>202</sup>, and M<sup>198</sup>), and the Phe cluster (F<sup>100</sup>, F<sup>114</sup>, F<sup>205</sup>, F<sup>208</sup>, F<sup>237</sup>, and F<sup>476</sup>), are rendered as blue, orange and red stick representations, respectively. Conformation presented during the first 25-ns (C), two conformations available after 25-ns and until the 30-ns ((D) and (E)), and the conformation presented from 30 to 50 ns (F). (G) The first and the most representative CYP2C11–4nVPA conformation present from 10 to 45 ns, and the second conformation present during the last 5 ns (H).

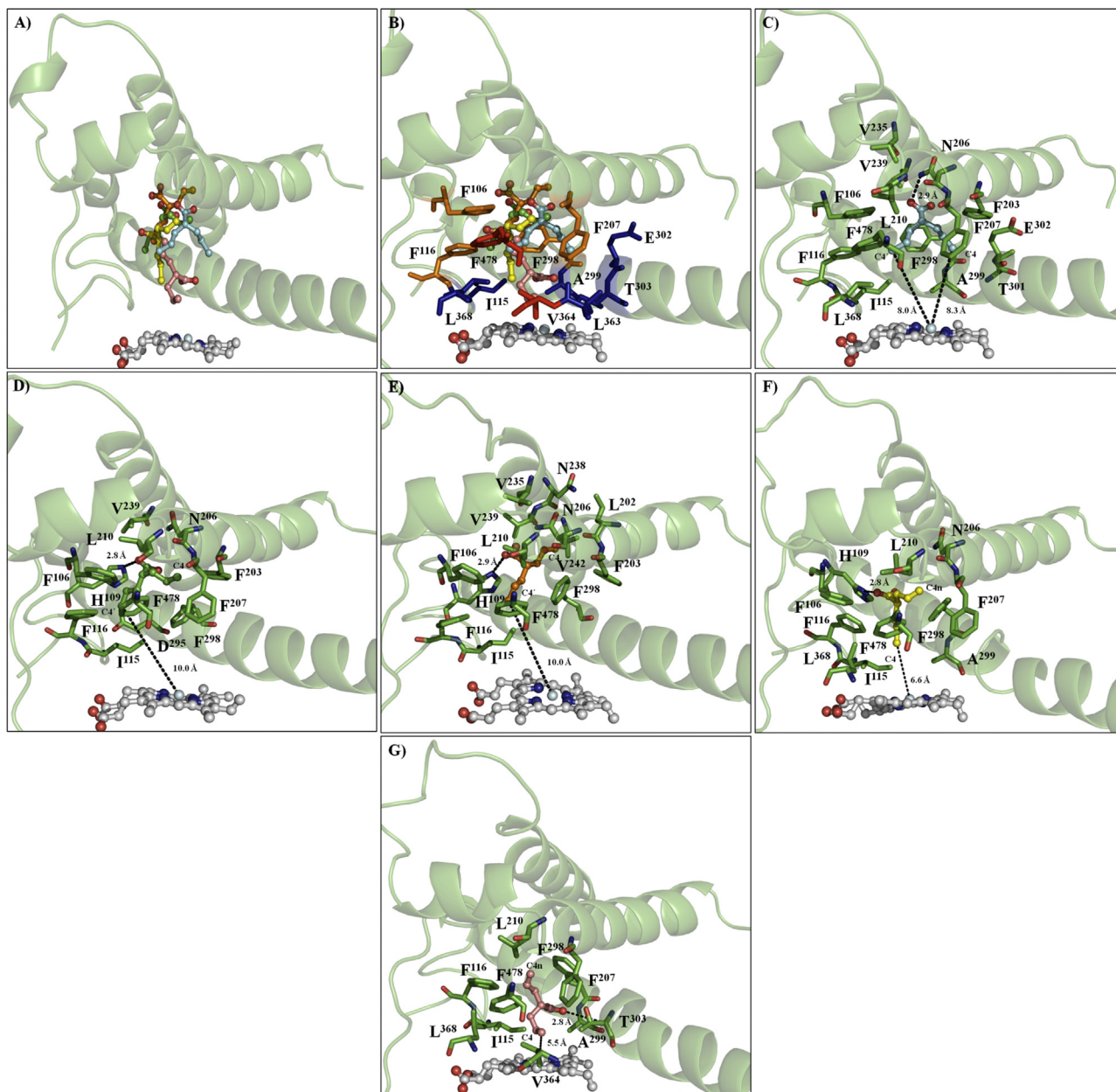
In addition,  $\Delta G_{\text{sol}}$  denotes the solvation free energy that can be computed as the summation of an electrostatic component ( $\Delta G_{\text{ele, sol}}$ ) and a non-polar component ( $\Delta G_{\text{non-polar, sol}}$ ), and  $-T\Delta S$  the contribution from the conformational entropy.

Entropic contributions were evaluated using MMPBSA.py module implemented in Amber Tools 1.5 [57], only 20 snapshots taken at time intervals of 200 ps were chosen. Because of the large memory demanding for this calculation, we did not use the entire system, therefore, an approach reported elsewhere [68], which only residues with any atom within 8 Å of the ligand in the last conformation (truncated system) were considered to perform the entropy calculation.

### 3. Results

#### 3.1. Sequence alignment results

The sequence alignment among CYP2C11 sequence and those of the two templates (CYP2C9, 1R90) and (CYP2E1, 1KOH) was carried out, and the protein sequence alignment is shown in Fig. 6. This analysis shows that the amino acid sequence of the aligned protein templates of chain A of CYP2C9 (1R90) exhibited the highest percentage of identity with that of CYP2C11 in the range of 74.42%. The percentage of identity between the chain A of CYP2C9 (1R90) and the chain A of CYP2E1 (1KOH) was 58.4%, whereas the percentage of identity between CYP2C11 sequence (Swiss-prot



**Fig. 5.** Average conformations of VPA and 4nVPA into the active site of CYP2E1. (A) Structural superposition of the average conformations of CYP2C11–VPA, and CYP2C11–4nVPA complex. (B) Residues constituting the hydrophobic cleft (I<sup>115</sup>, E<sup>302</sup>, A<sup>299</sup>, T<sup>303</sup>, L<sup>363</sup>, V<sup>364</sup>, and L<sup>368</sup>), narrow solvent channel (V<sup>364</sup> and F<sup>478</sup>), and the Phe cluster (F<sup>106</sup>, F<sup>116</sup>, F<sup>207</sup>, F<sup>298</sup>, and F<sup>478</sup>), are rendered as blue, orange and red stick representations, respectively. Two VPA conformations presented during the first 3-ns ((C) and (D)), and the third VPA conformation presented after 3-ns and until the end of the MD simulation (E). Conformation between 4nVPA and CYP2E1 during the first 10-ns (F), and the most representative conformation present after this time and until the end of the MD simulation (G).

entry code: P08683), and the chain A of CYP2E1 (1KOH) was 57.6%. Furthermore, this analysis shows that several residues lining the substrate binding site are conserved or highly conserved among the three CYPs: R<sup>97</sup>, I/V<sup>113</sup>, F<sup>114</sup>, N<sup>204</sup>, S<sup>209</sup>, N<sup>217</sup>, N<sup>238</sup>, T<sup>301</sup>, D<sup>293</sup>, A<sup>297</sup>, E<sup>300</sup>, T<sup>304</sup>, L<sup>361</sup>, L<sup>366</sup>, P<sup>367</sup>, and F<sup>476</sup>, that are R<sup>100</sup>, I<sup>115</sup>, F<sup>116</sup>, N<sup>206</sup>, S<sup>211</sup>, N<sup>219</sup>, N<sup>240</sup>, T<sup>303</sup>, D<sup>295</sup>, A<sup>299</sup>, E<sup>302</sup>, T<sup>306</sup>, L<sup>363</sup>, L<sup>368</sup>, P<sup>369</sup>, and F<sup>478</sup> in CYP2E1 (Fig. 6). Whereas some residues are only conserved between two CYPs: between CYP2C9 and CYP2C11 (F<sup>100</sup>), CYP2C11 and CYP2E1 (F<sup>205</sup>/F<sup>207</sup>) or CYP2C9 and CYP2E1 (L<sup>208</sup>/L<sup>210</sup>). Overall, these results show that despite the low sequence identity (20%) between some CYPs [23], the three CYPs studied here possess a relative high level of sequence identity which is present not only along their overall folding structures but also at the substrate binding sites.

### 3.2. Docking results

It has been reported that CYP2C9 and CYP2C11 possess activity toward VPA and although 4nVPA only constitutes one of the multiple secondary metabolites product of VPA metabolism, is the one with hepatotoxic properties and the main product of its dehydrogenation pathway [9]. On the other hand, despite CYP2E1 shows a marginal activity toward VPA [42], it was used for exploring the ligand orientation that is responsible of the low activity of this isoform toward it. The C4 site has been pointed out [9,11] as the site that undergoes site reaction mechanism, but detailed binding orientations and interaction profiles between these enzymes and VPA or 4nVPA were not reported until now. Therefore, in order to evaluate the binding pose of VPA and 4nVPA





through electrostatic interactions [11]. On the other hand, it has been stated that the bound pose with the lowest binding energy does not correspond in most cases to the metabolically active conformation [72], and that given the diverse nature of the validation set of each docking program, it is expected that some proteins will be easier to predict than others [73]. Besides, the inclusion of flexibility and water molecules in protein binding sites also have important ramifications in docking poses of substrates in the CYP active sites [72]. Therefore, MD simulations were performed to refine the map of interactions of VPA and 4nVPA in the three CYPs, since that it has been reported that the fact of including flexibility to the docked conformation might reduce the risk associated with inadequate ligand conformation [74].

### 3.3. Molecular dynamics (MD) simulations

The robustness and stability of the predicted 3D structures of CYPs–VPA and CYPs–4nVPA complexes obtained using docking methods were verified through MD simulations. Interestingly, during the first ns, all ligand conformations predicted by the Autodock scoring function were lost and other conformations present, where the aliphatic section of either VPA or 4nVPA was oriented toward the heme group, were stabilized through hydrophobic interactions, whereas the polar moiety was stabilized by hydrogen bonds.

### 3.4. MD results

The robustness and stability of the predicted 3D structures of CYPs–VPA and CYPs–4nVPA complexes obtained using docking methods were further verified through MD simulations. Interestingly, for all the cases, at first ns the ligand conformations predicted by Autodock scoring function were lost and other conformations were present where the aliphatic section of either VPA or 4nVPA was oriented toward the heme group, being stabilized through hydrophobic interactions whereas the polar moiety by hydrogen bonds.

According to the 50 ns MD simulation for the structure of CYPs complexes, the RMSD for the  $\alpha$ -carbon of CYPs as a function of the simulation time became equilibrated for the last 40 ns, with RMSD values that oscillated between 4.0 and 6.0 Å for all the complexes, values in agreement with those observed for the MD simulation studies between CYP2C9 and (S)-warfarin [75].

### 3.5. Interactional analysis and average properties

#### 3.5.1. The case of CYP2C9

Structural analysis of different CYP complexes has allowed to describe the different components of the substrate binding site, which is mainly constituted by three parts: hydrophobic cleft that consist of V<sup>113</sup>, L<sup>201</sup>, N<sup>204</sup>, I<sup>205</sup>, L<sup>208</sup>, V<sup>292</sup>, G<sup>296</sup>, A<sup>297</sup>, E<sup>300</sup>, and L<sup>366</sup>, a ceiling which consist of the Phe cluster (F<sup>100</sup>, F<sup>114</sup> and F<sup>476</sup>), and narrow solvent channel residues (R<sup>108</sup>, and L<sup>102</sup>) (Fig. 3B). For the CYP2C9–VPA complex was observed that at the first ns of MD simulations, the complex obtained through docking procedures (see Section 2.2) changed, giving place to another conformation where the polar interaction between the carboxylic moiety and the heme group was lost (Figs. 2C and 3C). In this new conformation, VPA packs next to helix I in a hydrophobic cleft that is formed by V<sup>113</sup>, L<sup>201</sup>, N<sup>204</sup>, I<sup>205</sup>, L<sup>208</sup>, V<sup>292</sup>, G<sup>296</sup>, A<sup>297</sup>, E<sup>301</sup>, and L<sup>366</sup>, the Phe cluster (F<sup>100</sup>, F<sup>114</sup> and F<sup>476</sup>), and R<sup>108</sup> (Fig. 3C), placing to VPA in close proximity to the second most preferred channel named pw2e [76] (Fig. 3B and C). Map of contacts that are in agreement with those observed for the crystallographic complex between 2C9 and flurbiprofen (FLP) [77] (Fig. 3B). In this latter complex, FLP is positioned with the site of hydroxylation located for oxidative

attack by the reactive, hypervalent iron-oxo intermediate derived from reduction of molecular oxygen by the enzyme [77]. For VPA, the aliphatic section was stabilized by several hydrophobic residues and placing the site of dehydrogenation (C4 atom) resides 6.7 Å from the heme iron (Fig. 3C), which is consistent with the distances seen in other CYP substrate complexes [77].

For the CYP2C9–4nVPA complex is observed that 4nVPA preferred another conformation so different than that observed for VPA, where the polar moiety was hydrogen bonding to N<sup>474</sup> and K<sup>206</sup>, whereas the aliphatic section was stabilized by several hydrophobic contacts either backbone or side-chain atoms. This ligand conformation shared few apolar contacts observed for VPA and the site susceptible to undergo a dehydrogenation reaction was localized in a farther distance (Fig. 3D). 4nVPA was located between helices F and I and the turn in the C-terminal antiparallel  $\beta$ -sheet. Interestingly, despite this region has been seen as a narrow solvent channel (pw2c channel) formed by I<sup>205</sup>, S<sup>209</sup>, and E<sup>300</sup> and V<sup>479</sup> in the crystal structure, this is only wide enough for water molecules to enter, and catalogued as narrower than pw2e channel [78]. MD simulations allowed to observe the increase of its width, which was attributed to the backbone and side-chain movements of I<sup>205</sup> and S<sup>209</sup> (mobile F helix) as well as side-chain movements of E<sup>300</sup> (stable I helix) because of their interactions with the ligand [75], suggesting that the narrow channel might be stabilized and widened in presence of substrate. Nevertheless, in this study we did not observe significant changes in the channel width, which slightly opened with distances between 7.5 and 9.5 Å.

#### 3.5.2. The case of CYP2C11

Despite the lack of structural information about the CYP2C11 structure, some models have been constructed using molecular modeling techniques and also coupled with organic molecules such as testosterone [35]. From these studies, it is known that ligands are mostly coordinated in the substrate-binding site of CYP2C11, which includes a hydrophobic cleft constituted by I<sup>113</sup>, T<sup>292</sup>, D<sup>293</sup>, G<sup>296</sup>, A<sup>297</sup>, E<sup>300</sup>, T<sup>301</sup>, and L<sup>366</sup>, a ceiling which consist of the Phe cluster (F<sup>100</sup>, F<sup>114</sup>, F<sup>205</sup>, F<sup>208</sup>, F<sup>237</sup>, and F<sup>476</sup>) (Fig. 4B) [79]. From which, nine of these amino acid residues, namely F<sup>100</sup>, F<sup>114</sup>, D<sup>293</sup>, G<sup>296</sup>, A<sup>297</sup>, E<sup>300</sup>, T<sup>301</sup>, L<sup>366</sup>, and F<sup>476</sup> corresponded identically to the key amino acid residues identified in the crystallographic CYP2C9–FLP complex (1R90), whereas that the Phe cluster at the ceiling (F<sup>100</sup>, F<sup>114</sup>, F<sup>205</sup>, F<sup>208</sup>, F<sup>237</sup>, and F<sup>476</sup>) is similar to that of human CYP3A4 [35]. On the other hand, as far as we are concerned, until now there is not information about its solvent channels. Therefore, in this study we evaluated the solvent channels for the different complexes of CYP2C11–VPA or CYP2C11–4nVPA obtained along the MD simulations using the MOLE program, which is designed for channel identification in macromolecules [80]. Derived from this latter analysis, several channels were found which exhibited a bottleneck radii smaller than 1.4 Å, which is the radius of the water molecule. However, a channel constituted by N<sup>202</sup>, P<sup>480</sup>, R<sup>307</sup>, T<sup>167</sup>, M<sup>198</sup>, F<sup>168</sup>, and H<sup>199</sup> was found (data not shown) in most of the complexes with a radii of 1.6–2.0 Å, and with bottleneck radii of 1.46 Å, suggesting a possible pathway to the entrance/exit of ligand, forming M<sup>198</sup>, and N<sup>202</sup> the narrowest part of the substrate access channel (Fig. 4B).

For the CYP2C11–VPA complex were observed four ligand conformations along the 50-ns long MD simulations. At the first ns of MD simulations, the complex obtained through docking procedures (see Section 2.2) changed as observed for CYP2C9–VPA, giving place to a ligand conformation where the carboxylic moiety established hydrogen bonds with R<sup>97</sup> and a polar backbone atom of F<sup>114</sup>, whereas the aliphatic chain was stabilized by several members of the Phe cluster, as observed for other homology modeling complexes [35]. This ligand conformation placed the C4



atom in a distance of 7.0 Å from Fe. This first conformation was present during the half of the MD simulations time (the first 25-ns) (Fig. 4C). After this time and until the 30-ns long MD simulation, VPA was still coordinated by several members of the Phe cluster, but the ligand adopted another conformations in which VPA was basically coordinated by hydrophobic interactions (Fig. 4D and E) and the closest C4 atom (C4 or C4') was into a atomic distance of 9.8 and 10.5 Å, whereas that the keto group was stabilized by R<sup>97</sup> and looking toward the Fe atom into a distance of 9.0 Å (Fig. 4E). Then, after this time and until the end of the MD simulation, VPA was placed in another protein region close to the substrate binding site and three Phe cluster members still made contacts with VPA (Fig. 4F). Although the more representative ligand conformations suggest that this ligand position could be consistent with that required to experience a dehydrogenation reaction, the other placed the ligand in a distance that would not allow the catalysis to occur as proposed by several studies [81].

For the CYP2C11–4nVPA complex two conformations were present, in the first and the most representative conformation of 4nVPA (Fig. 4G, 10 to 45 ns), this was coordinated by a number of residues also present in the CYP2C11–VPA complex (Fig. 4C–F and G–H). In this ligand conformation, only a residue that belongs to the Phe cluster was observed (F<sup>476</sup>), whereas the keto group formed a salt bridge with R<sup>97</sup>, in a similar manner to that observed for CYP2C11–VPA (Fig. 4C). In contrast, the second conformation (Fig. 4H, 45 to 50 ns) was mostly stabilized by a member of the Phe cluster but by a less energetically optimized salt bridge between the keto group and R<sup>97</sup>. Nevertheless, both ligand configurations placed the reduced C4 atom (C4n) into a similar distance from the Fe atom, shorter distance than that observed for VPA, suggesting that the reduced metabolite could be able to experience a further catalysis reaction (Fig. 4G–H).

### 3.5.3. The case of CYP2E1

CYP2E1 catalyzes oxidative reaction of not only low molecular weight xenobiotic compounds such as ethanol, but also endogenous fatty acids [82]. In contrast with CYP2C11 and CYP2C9 whose cavities are wide enough to accept bulky ligands, CYP2E1 is characterized by catalyzing small weight compounds and large fatty acids [82] and its active site size is considered as the smallest (~200 Å<sup>3</sup>) among human CYPs [83]. The structural feature might be responsible for the advantageous of CYP2E1 over the others CYPs to metabolize small weight compounds, then creating speculation about whether the pathways in CYP2E1 will differ from those found in other mammalian CYPs [82]. In the course of multiple co-crystallized complexes, it has been elucidated that as observed for CYP2C9 and CYP2C11 complexes, several conserved residues lining a hydrophobic cleft participate in the complex stabilization: I<sup>115</sup>, E<sup>302</sup>, A<sup>299</sup>, L<sup>363</sup>, V<sup>364</sup>, and, L<sup>368</sup>. The Phe-cluster is also present, including to F<sup>106</sup>, F<sup>116</sup>, F<sup>207</sup>, F<sup>298</sup>, and F<sup>478</sup>, which forms a ceiling on the binding pocket and blocked the channel 2c [82], as well as T<sup>303</sup> which is localized in helix I and plays an important role in the substrate recognizing and positioning by establishing hydrogen bonds with the substrate in the active site [84], whereas that V<sup>364</sup> and F<sup>478</sup> form the narrowest part of the substrate access channel, allowing substrate or solvent entering into or release [84] (Fig. 5B). Furthermore, punctual mutations over residues such as F<sup>478</sup>V showed to increase 7-ethoxy-4-trifluoromethylcoumarin deethylation activity but lower *p*-nitrophenol hydroxylation activity than wild type CYP2E1, indicating that these residues are important for the specificity of this isoform [85]. Although it has been reported a minimal inhibition activity of VPA on CYP2E1, the ligand orientation of VPA was explored to gain insight about this behavior [42].

At the beginning of the simulation, the ligand conformation presented in the docked CYP2E1–VPA complex (Fig. 2E) was lost as

observed for the CYP2C9–VPA and CYP2C11–VPA complexes, giving place to three energetically allowed states where the two first states were present during the three first ns and the third state started after 3 ns time and lasted almost during all the MD simulation. From Fig. 5C–E, it can be observed that VPA was mostly coordinated by residues that belong to the Phe cluster (F<sup>106</sup>, F<sup>116</sup>, F<sup>207</sup>, F<sup>298</sup>, and F<sup>478</sup>), which has been reported as important in the stabilization of some complexes obtained through crystallographic procedures [81,82] and also using MD simulations [84] whereas the polar group was forming salt bridges either with N<sup>206</sup> or H<sup>109</sup> or simultaneously with both residues. Interestingly, T<sup>303</sup> has been observed to play an important role in stabilizing and positioning the ligand through its interaction by a hydrogen bond [84]. In contrast, for the case of VPA, is observed that one of the residues that stabilize the polar group was N<sup>206</sup>, which also is seen to establish a hydrogen bond with the ligand in the co-crystallized complex between CYP2E1 and the omega-imidazolyl octanoic acid [83]. Furthermore, as observed for the CYP2C9 and CYP2C11 complexes, a cluster of Phe also was involved in stabilizing the VPA molecule. However, in contrast with the favorable ligand conformations showed by CYP2C9 and CYP2C11 complexes, the three ligand conformations present here, did not produce a ligand orientation that could be able to participate in an oxide-reduction reaction, since both C4 atoms were positioned into a distance between 8.0 and 10.0 Å from Fe atom, distance slightly higher in comparison with that reported for some static complexes [84] and another gotten through MD simulations [85].

For the CYP2E1–4nVPA complex was found that two states were experienced by 4nVPA into the substrate-binding site. Fig. 5F–G shows that 4nVPA was coordinated by almost the same type of residues than for CYP2E1–VPA. However, 4nVPA adopted another position that allowed it to establish a closer contact between C4 and the Fe atom, suggesting that perhaps this enzyme possess a higher affinity for the reduced metabolite rather than the native molecule.

### 3.6. Calculation of the binding free energy for the CYP's-ligand complexes

To gain more information about the energetic contribution between the residues surrounding the binding site and the ligand, the electrostatic energies, non-polar solvation, Van der Waals interactions and total contribution of the residues to the binding free energy were calculated with the molecular mechanics generalized born surface area (MM–GBSA) method [86,87] (see Section 2). This analysis shows that the complex formation is mainly driven by the non-polar ( $\Delta E_{\text{vwd}} + \Delta G_{\text{npol, sol}}$ ) contributions, being  $\Delta E_{\text{vwd}}$  interactions those that make the major contribution, whereas that the polar ( $\Delta E_{\text{ele}} + \Delta G_{\text{ele, sol}}$ ) interactions contributed scarcely or opposed to the binding (Table 1). Thermodynamic behavior that is supported by the map of interactions observed for each of the representative VPA and 4nVPA binding models, where is visualized that all the complexes are mainly stabilized through hydrophobic interactions (Fig. 7). The calculated binding free energy ( $\Delta G_{\text{bind}}$ ) was more energetically favorable for the complexes formed between CYP2C9, CYP2C11 or CYP2E1 and VPA, being the highest for the CYP2C11–VPA complex (CYP2C11–VPA<sub>c</sub>). In contrast, all the complexes between the three CYPs and 4nVPA produced smaller binding free energies and even unfavorable were observed for the CYP2C11–4nVPA complex. The entropic component was consistent among all the complexes, revealing that upon complex formation a decrement in their degrees of freedom is present which contributes with an unfavorable entropy component to the calculated binding free energy.

**Table 1**  
Binding free energy components of CYP's–ligand complexes (in units of kcal/mol).

| System                     | $\Delta E_{\text{vdw}}$ | $\Delta E_{\text{ele}}$ | $\Delta G_{\text{ele,sol}}$ | $\Delta G_{\text{npol,sol}}$ | $\Delta E_{\text{polar}}$ | $\Delta E_{\text{npol}}$ | $DG_{\text{mmgsa}}$ | $-T\Delta S$  | $DG_{\text{bind}}$ |
|----------------------------|-------------------------|-------------------------|-----------------------------|------------------------------|---------------------------|--------------------------|---------------------|---------------|--------------------|
| CYP2C9–VPA                 | –17.0 (0.15)            | –242.3 (1.3)            | 240.5 (1.2)                 | –2.65 (0.02)                 | –1.80                     | –19.65                   | –21.45 (0.2)        | –16.40 (3.0)  | –5.05              |
| CYP2C9–4nVPA               | –18.90 (0.15)           | –203.0 (0.72)           | 206.3 (0.6)                 | –3.31 (0.01)                 | 3.30                      | –22.21                   | –18.91 (0.20)       | –15.36 (1.4)  | –3.55              |
| CYP2C11–VPA <sub>c</sub>   | –21.0 (0.23)            | –255.0 (1.1)            | 256.34 (0.91)               | –3.24 (0.01)                 | 1.40                      | –24.24                   | –22.84 (0.3)        | –15.91 (1.15) | –6.93              |
| CYP2C11–VPA <sub>d–e</sub> | –18.95 (0.10)           | –200.0 (0.7)            | 206.0 (0.51)                | –2.74 (0.01)                 | 6.0                       | –21.69                   | –15.69 (0.15)       | –16.64 (2.10) | +0.95              |
| CYP2C11–VPA <sub>f</sub>   | –16.24 (0.10)           | –177.4 (0.40)           | 187.0 (0.40)                | –2.20 (0.01)                 | 9.6                       | –18.44                   | –8.84 (0.10)        | –17.11 (1.6)  | +8.27              |
| CYP2C11–4nVPA              | –12.1 (0.7)             | –153.0 (10.1)           | 157.0 (10.2)                | –2.01 (0.10)                 | 4.0                       | –14.2                    | –10.2 ± 0.73        | –19.0 ± 4.21  | +8.80              |
| CYP2E1–VPA                 | –19.0 (0.3)             | –351.0 (4.0)            | 348.0 (4.0)                 | –3.20 (0.04)                 | –3.0                      | –22.2                    | –25.0 ± 0.35        | –19.60 ± 2.75 | –5.40              |
| CYP2E1–4nVPA               | –16.6 (0.12)            | –337.0 (0.66)           | 343.0 (0.58)                | –2.77 (0.01)                 | 6.0                       | –19.37                   | –13.37 (0.15)       | –12.20 ± 5.73 | –1.17              |

The polar ( $\Delta E_{\text{ele}} + \Delta G_{\text{ele,sol}}$ ) contributions ( $\Delta E_{\text{polar}}$ ) and the non-polar ( $\Delta E_{\text{vdw}} + \Delta G_{\text{npol,sol}}$ ) contributions ( $\Delta E_{\text{npol}}$ ). All the energies are averaged over several snapshots (see Section 2) and are in kcal/mol ( $\pm$ standard error of the mean).

#### 4. Discussion

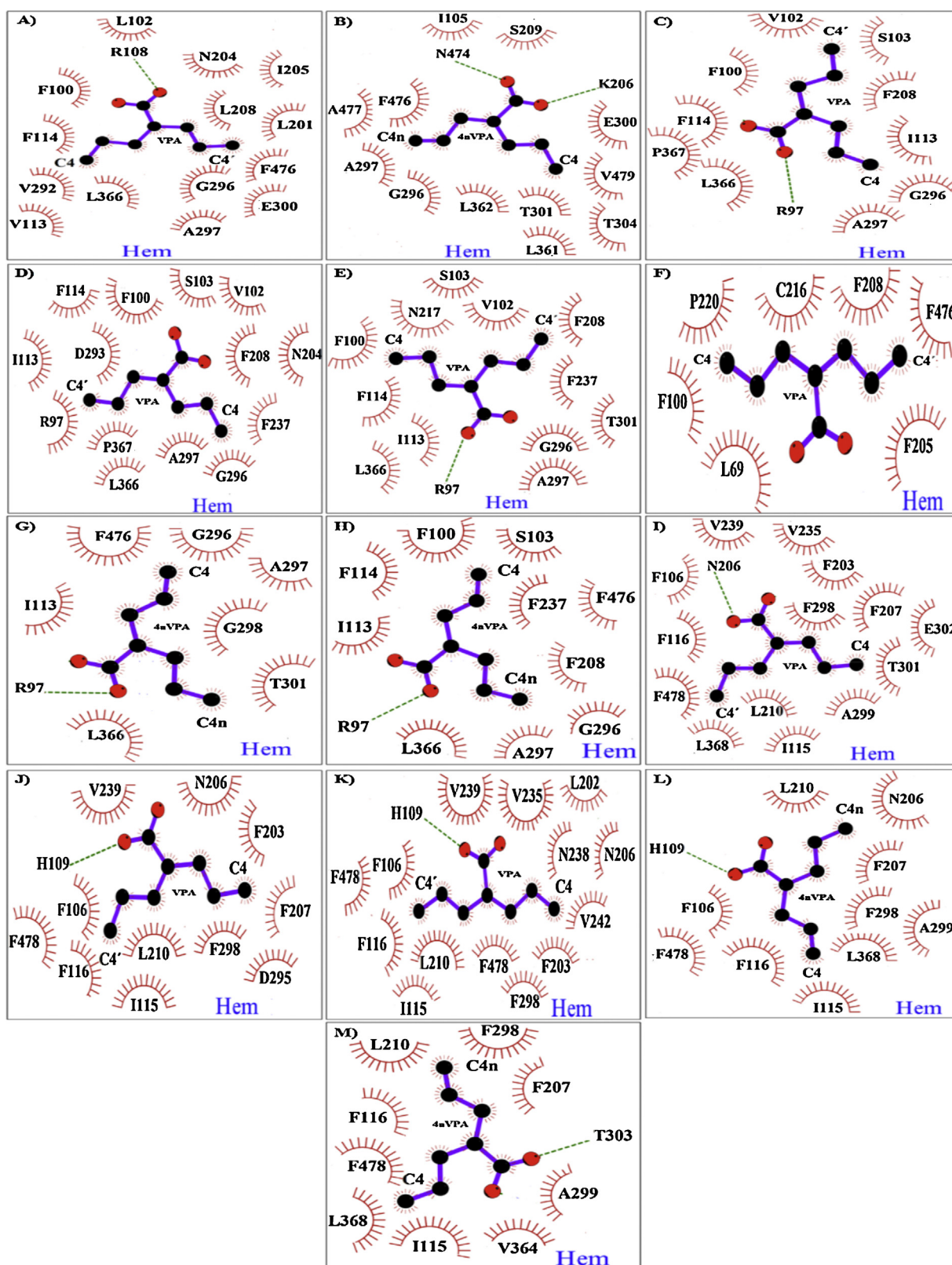
*In silico* methods have been widely used to investigate important features of CYPs, and particularly focused on the CYP2C9 active site [85,88,89] with the aim to predict positions of oxidation and determine important structural features that confer selectivity. Initially, because of the lack of structural information, CYPs structures were obtained through homology modeling procedures. Nowadays the availableness of several structures of CYPs has been so useful to further improve our knowledge about the ligand recognition between several organic molecules and CYPs molecules. Among these structures, CYP2C9 was one of the first structures released in the PDB forming complex with warfarin (PDB entry, 1OG5), although this complex showed an unproductive ligand conformation because the substrate lies in a mostly hydrophobic cavity at a distance of 10 Å from the heme unit [71]. MD simulation allowed to explore several ligand conformations in which warfarin was positioned in a favorable distance as to undergo a 6-7-hydroxylation [75], with a marked geometrical preference for position 7 over position 6 and also with an important structural contribution of F<sup>476</sup>. Furthermore, analysis of the substrate cavity of CYP2C9 (470 Å<sup>3</sup>) and NMR studies indicated that this isoform is able to bind two different ligands simultaneously [90]. Later on, other crystal structure of CYP2C9 was published with FLP bound (PDB entry, 1R9O), which is known to undergo oxidation, primarily by 4'-hydroxylation. For this complex, in contrast with that observed in the 1OG5 structure, the 4'-oxidation site was within an appropriate distance for oxidative attack by the reactive hypervalent iron-oxo intermediate derived from the reduction of molecular oxygen by CYP2C9. Substrate-heme distance that is in agreement with that observed through NMR studies was between 3.3 and 6.2 Å [91]. The lack of 3D information of several complexes between CYPs and some molecules for which experimental evidence about their hydroxylation or dehydrogenation has been observed, has led to choose some computational approaches, such as docking procedures to gain insight into the reaction mechanism [13,36]. However, this method is limited to some extent by poor contribution of the protein flexibility and some other factors [38]. Therefore, molecular docking and molecular simulation have been combined to tackle the environment problems including oxidative polymerization of alkyl phenols [92], but up to date a combined approach of these two methods to model CYPs has not been used. To address this issue, we performed molecular docking and MD simulations using available structural information (CYP2C9 and CYP2E1) and also homology modeling techniques (CYP2C11) to obtain our proteins, which then were coupled through docking procedures and simulated for 50 ns using MD simulations. Our docking results revealed that a common ligand conformation into the binding site of the three CYPs was present for both VPA and its reduced metabolite 4nVPA, in which the polar moiety was making interaction with the heme group into a distance of 4 Å, whereas

that the potentially place to experience an electrophilic attack was in a opposed orientation to the center ferric atom of the heme group. This conformation was modified at first ns of MD simulations, leading to a range of energetically accessible ligand conformations for the three CYPs. For all the systems was observed that the aliphatic section of VPA was stabilized by hydrophobic residues, but for CYP2C11 and CYP2E1 a higher number of Phe residues was seen coordinating the VPA than for CYP2C9, whereas the polar moiety was hydrogen bonding to polar residues and for most the residues observed stabilizing these complexes there is structural evidence [35,77].  $DG_{\text{bind}}$  values were more energetically favorable for the complexes formed between CYP2C9, CYP2C11 or CYP2E1 and VPA than for 4nVPA, corroborating the expected high affinity for VPA than for the reduced metabolite.

For the CYP2C9–VPA complex only one VPA conformation was present in which the closest C4 atom was positioned into an atomic distance (6.7 Å) for electrophilic attack, which is consistent with the distances seen in other CYP2C9 substrate complexes [77]. In contrast, for the CYP2C9–4nVPA complex, 4nVPA adopted another conformation so different than that observed for VPA, in which was located in close proximity to a water channel observed through MD simulations [75]. The susceptible site (C4 atom) to undergo a second dehydrogenation reaction was localized in a farther distance than for VPA. Both results are characteristic of an inactive substrate that is being expelled out of the catalytic binding site.

Four ligand states were present for VPA in the CYP2C11–VPA complex where the most predominantly VPA conformation placed the closest C4 atom into a distance of 7.0 Å from Fe atom, distance consistent with that required to experience a dehydrogenation reaction, whereas the other three remaining states would not allow the catalysis to occur as proposed by several studies [81]. For the CYP2C11–4nVPA complex two states were present from which the most representative 4nVPA conformation placed the reduced C4 atom (C4n) into a similar distance from the Fe atom, in a shorter distance than that observed for VPA, suggesting that the reduced metabolite could be able to experience a further catalysis reaction.

For the CYP2E1–VPA complex three energetically states were present where the most representative state did not produce a ligand orientation that could be able to participate in an oxide-reduction reaction, since both C4 atoms were positioned into a distance between 8 and 10.0 Å from Fe atom, distance slightly higher in comparison with that reported for some static complexes [81] and another observed through MD simulations [82]. Therefore, this less favored ligand conformation could be responsible for the minimal inhibition activity experimentally reported for this human CYP isoform [42]. For the 2E1–4nVPA complex, two 4nVPA states were present into the substrate-binding site adopted a ligand position that would allow it to establish a closer contact between C4 and the Fe atom, suggesting that perhaps this enzyme possess a higher affinity for the reduced metabolite rather than the native molecule.



**Fig. 7.** Schematic representations of hydrogen bonds (green dashed lines) and hydrophobic contacts (red arc with spokes) of CYP2C9–VPA (2SA), CYP2C9–4nVPA (2SB), CYP2C11–VPA (2SC-F), CYP2C11–4nVPA (2SG and H), CYP2E1–VPA (2SI-K), and CYP2E1–4nVPA (2SL and M) complexes. Drawings were generated using LIGPLOT v.4.5.3 [94], and the average conformations from Figs. 3C and D, 4C–H, and 5C–G.

The multiple ligand conformations present for CYP2C11 and CYP2E1 suggest a high flexibility into the catalytic binding site that could work as an adaptive mechanism to place the substrate through subtle conformational changes that contribute to get more

favorable energetic states. Furthermore, the presence of multiple binding orientations may give place for the production of multiple oxidized metabolites as observed for the case of hydroxylation of progesterone into the catalytic binding site of CYP2C5 [93].



Based on these results, it is clear that geometrical preference is regulated by the chemical nature of the substrate, the substrate binding cavity and the flexibility of the residues constituting the catalytic binding site. Therefore, the regioselectivity is a result of the chemical and shape of the protein and ligand rather than caused by local interaction near the heme oxygen as mentioned by Seifer et al. [75]. Furthermore, our results have important contribution to the details of enzyme-catalyzed reactions in the process of VPA dehydrogenation, which can broaden our knowledge of this reaction mechanism. However, in contrast to soluble bacterial CYPs, mammalian CYPs are membrane-anchor proteins bound to a lipid membrane through the N-terminal transmembrane helix, so the ligand conformation observed here may be improved in a more physiological system.

In conclusion, docking and MD simulation studies were performed to gain insight into the regioselectivity of VPA into three CYPs for which it is known to exhibit affinity. Our results showed VPA states into the CYP catalytic cavity of CYP2C9 and CYP2C11 where C4 was oriented toward the Fe atom for electrophilic attack and therefore experiences a dehydrogenation reaction, but a less favored C4 position was observed for CYP2E1, corroborating the lower affinity reported from this CYP to VPA. On the other hand, 4nVPA showed some differences with respect to its placing into the three CYPs. For the CYP2C9–4nVPA complex, 4nVPA not only showed a less optimized map of interactions, result that was in agreement with its unfavorable  $DG_{\text{bind}}$  value, but also was collocated close to a water channel, suggesting that 4nVPA is not candidate to experience further catalytic reaction in this CYP and that maybe is being expelled from the catalytic binding site. In contrast, for the CYP2C11–4nVPA and CYP2E1–4nVPA complexes, 4nVPA showed states that suggest further catalytic reactions because of its shorter distance to the Fe atom in comparison with the observed for VPA. However, binding free energy analysis showed unfavorable and marginal favorable  $DG_{\text{bind}}$  values for CYP2C11–4nVPA and CYP2E1–4nVPA complexes, suggesting that these states could correspond to energetic transient states. Overall, these results show that not only the chemical nature of the CYPs cavity and its intrinsic flexibility play an important role in ligand stabilizing and positioning, but also the chemical structure may have critical structural effect on the binding pose of the ligand, promoting ligand orientation toward heme group in the three CYPs.

### Authors contributions

MB: project design, achieve the theoretical studies, results analyses and write the article; JMW: results analyses and write the article; JCB: project designs, results analyses and write the article.

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