

## Insights into the Degradation of Polymer–Drug Conjugates by an Overexpressed Enzyme in Cancer Cells

Pedro R. Figueiredo, Ricardo D. González, and Alexandra T. P. Carvalho\*

 Cite This: J. Med. Chem. 2023, 66, 2761–2772
 Read Online

 ACCESS
 Image: Metrics & More
 Image: Article Recommendations
 Image: Supporting Information

**ABSTRACT:** Intensive efforts have been made to provide better treatments to cancer patients. Currently, nanoparticle-based drug delivery systems have gained propulsion, as they can overcome the drawbacks of free drugs. However, drug stability inside the nanocapsule must be ensured to prevent burst release. To overcome this, drugs conjugated to amphiphilic copolymers, assembled into nanoparticles, can provide a sustained release if endogenously degraded. Thus, we have designed and assessed the drug release viability of polymer–drug conjugates by the human Carboxylesterase 2, for a targeted drug activation. We performed molecular dynamics simulations applying a quantum mechanics/molecular



mechanics potential to study the degradation profiles of 30 designed conjugates, where six were predicted to be hydrolyzed by this enzyme. We further analyzed the enzyme–substrate environment to delve into what structural features may lead to successful hydrolysis. These findings contribute to the development of new medicines ensuring effective cancer treatments with fewer side effects.

#### INTRODUCTION

Cancer is a major worldwide problem with 19.3 million new cases estimated in 2020, and its incidence rate is growing along with the longer life expectancy of today's society.<sup>1</sup> This leads to the need for better therapies, but, regardless of the huge investments in anticancer therapies, classic chemotherapy still produces the best response rates.<sup>2</sup> This may be problematic, as free drugs have poor aqueous solubility and short biological half-life, but also because they are often harsh to patients, as they can culminate in high systemic toxicity, and can lead to the development of multidrug resistance, lowering the patients' life quality.<sup>3</sup> These limitations have been thoroughly explored, and NP tumor targeting has emerged as a reliable path to overcome them. NPs are widely divided into several categories based on their morphology, size, and chemical properties, which enhances the scope of NPs use.<sup>4</sup> The drug release from NPs is controlled by several factors, such as drug location, the NP formulation, and the ease with which the drug can diffuse through the matrix system. A major issue with physical encapsulated drugs is the possible occurrence of burst release.<sup>3</sup> Polymeric NPs, for instance, are nanocapsular shaped, usually organic-based, and are currently being investigated at various phases of clinical trials for advanced delivery, with high interest in the oncological field-breast, colorectal, and non-small-cell lung cancers.<sup>6–8</sup> Nevertheless, clinical trials of anticancer drugs conjugated to water-soluble polymers were all terminated at different stages due to limited therapeutic response and unexpected toxicity. Part of the failure can be attributed to their small size (<40 kDa), which leads to rapid clearance from circulation through renal filtration.<sup>6</sup> It is here that the yielding of PDCs (Figure 1A) via conjugation of drugs molecules to



Figure 1. Representation of a PDC (A) and an inverted micelle composed of PDCs (B). Yellow balls represent the anticancer drug that is conjugated with the polymeric carrier (wavy tail). The hydrophobic and hydrophilic units of the polymer are colored blue and green, respectively.

bioresorbable polymeric carriers provides plenty of advantages over physical encapsulation and water-soluble polymers. A

Received: November 1, 2022 Published: February 14, 2023





© 2023 The Authors. Published by American Chemical Society Scheme 1. Generalized Enzymatic Degradation Mechanism for the Conversion of PDCs into the Free Drug and Polymeric Carrier<sup>a</sup>



<sup>a</sup>The oxyanion hole residues are omitted for simplicity. In the acylation step, the prodrug is activated, and the polymeric carrier is released by the end of the deacylation step.

covalent bond is more effective in stabilizing the drug inside the polymeric micelle and the polymer more resistant to hydrolysis. Also, through PDCs, the drug release inside the tumor tissues can be controlled since the bond between the drug and the polymer needs to be broken to allow drug's activity. Furthermore, micellar structures of PDCs (Figure 1B) can increase aqueous solubility and stability, extend plasma half-life, and can be engineered for targeted delivery and biodistribution, as well as their size.

In the controlled release of PDCs, the active anticancer drug can be achieved through specific cleavage such that the polymeric units act as a cleavable linker to release the drug from the conjugate. For systemically delivered PDCs, these linkers must be stable in blood circulation to increase drug accumulation in the target sites and to avoid side effects in case of early drug release.

hCE are known to cleave several clinically important classes of drugs (e.g., anticoagulants, angiotensin-converting enzyme inhibitors, antihyperlipidemic agents, antivirals, chemotherapeutics, immunosuppressants, and psychoactive drugs).<sup>9</sup> To date, six isoforms were identified (hCE1-6) based on sequence homology, where hCE1 and hCE2 are the most relevant and studied isoforms for drug metabolism.<sup>10</sup> Comparing these isoforms, hCE1 tends to hydrolyze small substrates, esters with small alcohol groups, and large acid groups, whereas hCE2 follows the inverse trend.<sup>11</sup> As an example, the extensively studied substrate cocaine is metabolized by hCE1 with hydrolysis of methyl ester, while hCE2 catalyzes the cleavage of the benzoyl ester, which is consistent with the structure of the reactive site.<sup>11</sup>

The hCE2 is present within the lumen of the endoplasmic reticulum in many tissues,<sup>12</sup> and is overexpressed in tumor tissues (in several cancer cell lines), with a small-scale expression in healthy cells. This allows for selective degradation of PDCs in tumor cells<sup>13</sup> and, therefore, for a targeted action, making it of great interest since it can be used to enhance prodrugs' activity.<sup>14,15</sup> Several studies inspected the capacity of this enzyme to hydrolyze chemotherapeutic prodrug agents. A gemcitabine prodrug (LY2334737) was found to be hydrolyzed by hCE2 intracellularly, arresting cell division.<sup>16</sup> Similarly, a prodrug of 5-fluorouracil (capecitabine),

which presents a similar structure to gemcitabine, was found to be cleaved by the enzyme in intestinal tissues, where its expression is relevant, allowing for a better response to the drug in colon cancer patients.<sup>17</sup> With a more complex structure, three metabolites of the SN38's prodrug (irinotecan) were found to be metabolized by hCE2 to the drug's active form.<sup>18</sup> Following these examples, the enzymatic activation of a doxorubicin derivative prodrug (pentyl PABC–Doxaz) was also explored and demonstrated to be primarily hydrolyzed by the hCE2.<sup>19</sup> Interestingly, these studies compared the hydrolysis by three hCE isoforms (hCE1-3), and most found that the highest catalytic activity was achieved by hCE2.

In this work, we have designed, tested, and scanned the drug release viability from polymeric models of 30 PDCs through enzymatic degradation using the hCE2. We have evaluated the capacity of hCE2 recognizing the 30 PDCs with covalent docking and MD simulation methods. Then, we applied QM/ MM to scan the PES for the acylation (48 trajectories) and deacylation (6 trajectories) steps. For the best-ranked profiles, the FEL were also calculated. We show that drug's features (smaller size and with a flat core) are key to provide a good binding conformation, which is imperative for the enzymatic hydrolysis to occur.

#### RESULTS

**Enzymatic Degradation Mechanism.** Previously, we have developed an hCE2 model, as no crystal structure was deposited in the PDB database. We have successfully determined the enzymatic FEL for (–)-cocaine hydrolysis and identified the rate-limiting step as the fourth transition state for this reaction.<sup>20</sup> The calculated energetic barrier (19.5 kcal mol<sup>-1</sup>) was in excellent agreement with the experimentally determined rate constant (that corresponds to 19.7 kcal mol<sup>-1</sup>).<sup>21</sup> Also, we showed that the hCE2 active site is located below two mobile  $\alpha$  helices ( $\alpha$ 1 and  $\alpha$ 10') that mediate substrate entrance.

The active site has two pockets (acyl and alcohol) with different sizes and orientations, and the catalytic triad is composed of S201-H448-E334 and an oxyanion hole region (amide groups of A202, G122, and G123). These amide



Figure 2. Structure of the designed PDCs based on the gemcitabine (1-2), SN38 (3–4), doxorubicin (5–7), paclitaxel (8–10), and polymeric carriers (11). a (PCL)  $R_1,R_4=H$ ,  $R_2,R_3=CH_2$ ,  $R_5=CH_2OH$ ; b (PGA)  $R_1,R_4=H$ ,  $R_2=O$ ,  $R_3=CO$ ,  $R_5=OH$ ; c (PLA)  $R_1,R_4=CH_3$ ,  $R_2=O$ ,  $R_3=CO$ ,  $R_5=OH$ .

groups stabilize the negative charge of the tetrahedral intermediates. The S201 residue acts as the nucleophile and the H448 as an acid/base that is stabilized by an E334 residue (Scheme 1). The first part of the PDCs degradation mechanism (usually identified as the acylation step, Scheme 1) concerns the formation of the EAM structure, where the active drug is released from the carrier (prodrug activation). The cycle starts with a nucleophilic attack of S201 to the PDC ester group (**RC**) that connects the drug to the polymeric unit.

The hydroxyl hydrogen of S201 is concertedly transferred to the H448 during the TS1, to establish the TI1. To move the reaction forward, the positively charged histidine needs to transfer the received hydrogen to the drug's oxygen atom  $(O_{drug})$ . The negative charge developed in the tetrahedral intermediate oxygen (and stabilized by the oxyanion hole residues) is neutralized with the ester bond breakage (TS2) to form the EAM structure—and the free drug is released. Then, for the enzyme to activate another drug, the polymeric carrier needs to be released from the enzyme's active site. This is achieved during deacylation, as it generates the PC structure. The nucleophilic attack by a water molecule generates a TI2. The water proton is transferred to H448 simultaneously with the nucleophilic attack of the water molecule (through the TS3), producing the TI2. The polymeric unit is then released from S201 (PC) with proton transfer (TS4) from H448 to the S201 side-chain oxygen atom  $(O_{S201})$ .

Degradation Profile for the Drug Release. The anticancer drugs here explored (gemcitabine, SN38, paclitaxel,

and doxorubicin), act by interfering with pathways involved in cancer biology either via DNA modifications, such as phosphorylation or intercalation with the nucleic acids or by inhibiting enzymes important for DNA integrity and structure (e.g., DNA topoisomerases).<sup>23,24</sup> Some, as irinotecan's active metabolite SN38 (7-ethyl-10-hydroxycamptothecin) and taxanes (such as paclitaxel), act as co-adjuvant chemotherapy agents of cisplatin or carboplatin, enhancing their activity.<sup>25</sup> These drugs pose clinical importance as they have been shown to be effective in several types of cancers, from (metastatic) non-small-cell lung, pancreatic, bladder, colorectal, ovarian, and breast cancer, with doxorubicin exhibiting a broad activity spectrum.<sup>28</sup> Nevertheless, side effects have been reported, spanning from dose-related side effects (e.g., doxorubicin can cause nausea, vomiting, myelosuppression, alopecia, and cardiotoxicity),<sup>29</sup> poor water solubility (taxanes),<sup>30</sup> cytotoxicity (e.g., SN38 breaks the DNA double-strand),<sup>31</sup> and systemic effects (e.g., gemcitabine can cause gastrointestinal disturbances, renal impairment, pulmonary toxicity, and influenza-like symptoms).<sup>30</sup> This leads to the need for careful dose management and prescription according to patients' needs.

The designed PDC models (Figure 2) comprise two units: an anticancer drug (gemcitabine, SN38, paclitaxel, or doxorubicin) and a hydrophobic polymeric model (PCL, PGA, and PLA), where the drugs' free hydroxyl groups were explored for conjugation with the polymeric unit. Concerning the latter, in the PCL derivatives, only one monomer of  $\varepsilon$ caprolactone [ $-C(O)(CH_2)_5OH$ ] was modeled, while for the PGA and PLA derivatives, two monomers [-C(O)XOH](X=CH<sub>2</sub> for PGA and X=CH<sub>2</sub>(CH<sub>3</sub>) for PLA) were modeled to achieve the same model "size" as PCL. In physiological conditions, these polymeric units are degraded by hydrolysis of their ester linkages. Thanks to their biocompatibility and biodegradability, they are used in biomedical applications such as implants (PCL), suture materials (PGA), and polymeric scaffolds for drug delivery systems (PLA).<sup>22</sup> To decrease the models' complexity, we opted not to include the hydrophilic unit (PEG).

Each considered drug (Figure 2) possesses at least two hydroxyl functions. We have functionalized several of them with a polymeric carrier unit (PCL, PGA, or PLA model). Covalent molecular docking was employed to determine the best TI1 posing conformation in relation to the hCE2 active site pocket. After MD was applied to the best conformation, the degradation mechanism by the hCE2 was explored with QM/MM simulations with PES scans, from which the bestranked were further characterized by calculating the FEL (the best-ranked systems are displayed in the manuscript, while the remaining systems are supplied in the Supporting Information with a mechanistic discussion, Figures S1-S12). We considered that free energies above 25.0 kcal mol<sup>-1</sup> correspond to processes that occur too slowly to be biologically relevant; therefore, we have defined this value as our threshold. The best-ranked systems are summarized in Figure 3, and as discussed later, the polymeric carrier release does not inhibit another enzyme turnover.



**Figure 3.** Acylation free energy profiles for the best-ranked PDCs: 2a, 4a-b, and 6a-c, derived from the FEL calculations. The energetic values were calculated with B3LYP-D3/6-31++G(d,p)/MM<sup>32,33</sup> and are given in kcal mol<sup>-1</sup>:  $\Delta G^{\ddagger}$  TS1 (2a:22.0; 4a:22.3; 4b:20.2; 6a:19.9; 6b:18.3; 6c:22.7) and  $\Delta G^{\ddagger}$  TS2 (2a:22.2; 4a:19.4; 4b:19.1; 6a:20.8; 6b:21.6; 6c:23.7). FEL maps and remaining PES profiles are provided in the Supporting Information (Figures S1–S12).

We started the screening with the drug molecule depicting the simplest structure (gemcitabine, 1-2) where only two hydroxyl functions are available for conjugation. Then, we increased the systems' complexity with more hydroxyl functions and molecular size (paclitaxel, 8-10).

**Gemcitabine-Based Conjugates.** In the gemcitabine conjugates, the drug's portion at **TI1** interacts with the active site via a hydrogen-bond network between the carbonyl of the drug's ring, K440 side-chain amine, D447 carboxylate, and the substrate amine with the F81 backbone oxygen. Weak VdW interactions between the L77 and L452 side chains with the

substrate aromatic ring were also observed. Contrary to what we have observed for 1a-c, in 2a-c, the K448-D477 side chains' hydrogen bond is not present. Instead, a new NH- $\pi$ interaction arises between the drug's amine function and the F81 aromatic ring, and the latter interacts with the L77 side chain via VdW interactions. The  $H\varepsilon_{H448}$  preference for interaction with the O<sub>S201</sub> atom at the TI1 structure is slightly deflected in the case of conjugates 2, where the  $\mathrm{H}\epsilon_{\mathrm{H448}}$  atom is more positioned in the middle of O<sub>drug</sub> and O<sub>S201</sub> (Figures 4 and S2-S4). The energetic barriers for the formation of the TI1 structure of 1a-c are always lower than the ones for the drug release (on average less than 8.0 kcal  $mol^{-1}$ , Figure S1) and well above the defined threshold. This may be correlated with the combination of a higher distance of the  $O_{drug}$ -H $\varepsilon_{H448}$ bond and the angles that are far from the ideal (100.4–111.3°, Figure S2). In opposition, with the functionalization of the other hydroxyl (2a-c, Figure 3), the TI1 formation has an associated barrier lower than drug release. Here, they are always comparable with a small deviation between barriers (on average 0.5 kcal mol<sup>-1</sup>, Figures 3 and S2), showing that the NH– $\pi$  interaction with F81 could better stabilize the reaction under study.

For the best-ranked conjugate **2a** (Figure 2) the **TS1** has an energetic barrier of 22.0 kcal mol<sup>-1</sup> (Figures 3 and S1), while the drug release has a similar  $\Delta G^{\ddagger}$  of 22.2 kcal mol<sup>-1</sup> (Figures 3 and S2). The position of H448 results in a better angle for the forward reaction compared to **2b**-**c** (Figures 4B and S3B and S3E).

SN38-Based Conjugates. In the SN38 conjugates, we observed considerable differences in their free energy barriers (Figure S4). In the allylic derivatives (3a-c, Figure 2), the calculated  $\Delta G^{\ddagger}$  for **TS1** is 28.5 for **3a**, 22.4 for **3b**, and 16.7 kcal mol<sup>-1</sup> for 3c (Figure S4), where the 6.0 kcal mol<sup>-1</sup> difference between 3b-c may be attributed to the presence of a methyl group from the PLA unit in the adjacent carbon atom from  $C_{T}$ , which may assist the formation of the dioxolane ring in the TI1 structure (explained below). On the benzylic derivatives (4a-c, Figure 2), this  $\Delta G^{\ddagger}$  correlates with the angles for the  $C_T - O_{S201}$  bond, with a similar energy value of 21.2 kcal  $mol^{-1}$  (Figure S4). In 4c, a much lower angle (4c, Figure S6) induces an increase of 6.0 kcal  $mol^{-1}$  in the free energy barrier compared to 4a-b (Figure 5). When the TI1 structure of **3a**–**c** is established (Figures S5B, S5E, and S5H), we observed a peculiar delocalization of the negative charge (Scheme 2) first developed in the carbonyl oxygen atom of the polymer-drug ester group. The negative charge of the O<sup>a</sup> atom is delocalized between oxygens O<sup>a</sup> and O<sup>b</sup> by the formation of a five-membered dioxolane ring (Scheme 2).

The **TI1** conjugated system core interacts with the enzyme mainly by VdW forces and the aromatic hydroxyl function with hydrogen bonds. The L76, L77, L80, and F81 side-chain groups are responsible for the VdW forces in 3a-c, while fewer were observed in 4a-c, being mainly performed by A73, L77, and V126 side-chain groups.

On the other hand, the substrate hydroxyl in **3a**-c interacts by hydrogen bonding with the backbone oxygen atom of L80, creating a 4-residue network (L80-S201-K440-D447). In opposition, the portion of the drug in the **4a**-c derivative seems to be able to rotate, as fewer hydrogen bonds are interacting with the substrate core. The majority of the simulated **3** and **4** conjugates (Figures S5 and 5, respectively), have the  $H\varepsilon_{H448}$  atom closer to the O<sub>drug</sub> atom than to O<sub>S201</sub> at the **TI1** structure. Exceptions to this are the **3c** and **4b** that inal Chemistry pubs.acs.org/jmc

Figure 4. Active site pocket reference structures of the lowest-energy stationary points RC, TI1, and EAM of 2a (A–C, respectively), where key distances are given in Å, and the free gemcitabine drug is here shortened to GEM. Reference structures for 2b-c are presented in the Supporting Information (Figure S3).



**Figure 5.** Active site pocket reference structures of the lowest-energy stationary points **RC**, **TI1**, and **EAM** of **4a** (A–C, respectively) and **4b** (D–F, respectively), where key distances are given in Å. Reference structures for **4c** are presented in the Supporting Information (Figure S6).





<sup>*a*</sup>The polymeric unit is here shortened to pol.

favor the  $H\epsilon_{H448}$ -O<sub>S201</sub> bond. The delocalization of the negative charge from O<sup>b</sup> to O<sup>a</sup> as the drug is released (**TS2**) in the 3 conjugates requires more than 30.0 kcal mol<sup>-1</sup> to occur

(Figure S4). The fact that the negative charge needs to "move" between more atoms in  $3\mathbf{a}-\mathbf{c}$  in contrast to  $4\mathbf{a}-\mathbf{c}$  can be one of the possible justifications for the increased amount of energy demanded for the reaction to occur. Accordingly, the  $\Delta G$  toward the TS2 for  $4\mathbf{a}-\mathbf{c}$  equals to around 19.2 kcal mol<sup>-1</sup> (Figure 3), although a higher barrier was calculated for  $4\mathbf{c}$  (23.1 kcal mol<sup>-1</sup>, Figure S4) that was attributed to the rotation that occurred in the drug's core, which positioned the reactive atoms in a bad conformation compared to the other 4 derivatives.

**Doxorubicin-Based Conjugates.** For the doxorubicin derivatives, we have explored three hydroxyl functions: (i) the hydroxyl of the sugar moiety (5a-c), (ii) the one linked to the allylic core ring via the acetyl bridge (6a-c), and (iii) the one linked directly to the same ring (7a-c, Figure 2). The two hydroxyls from the aromatic core ring (Figure 2) and the amine function were not explored. Due to resonance effects, the hydroxyl proton atoms are placed between the hydroxyl and the nearby carbonyl oxygen atoms (angles for these

Article

D



Figure 6. Active site pocket reference structures of the lowest-energy stationary points RC, TI1, and EAM of 6a (A-C, respectively), 6b (D-F, respectively), and 6c (G-I, respectively), where key distances are given in Å, and the free doxorubicin drug here shortened to DOX.

A202

D334

α=115.4° δ=157.3°

hydrogen bonds are usually around  $150.0^\circ$  in all of the simulated cases). On the other hand, the functionalization of the amine sugar moiety results in an amide function such that hydrolysis would require a greater energy compared to the ester moiety. As we intend to develop PDCs that could be released in situ, we have not explored this position.

5201

A202

D334

θ=148.8

The formation of the TI1 structure for the 5 conjugates is in general higher than our threshold. For 5a,c this value rounds up to 27.0 kcal  $mol^{-1}$ , while for **5b**, the calculated barrier is less than 4.0 kcal mol<sup>-1</sup> (Figure S7). Conjugates 6a-c have a much smaller predicted barrier than 6 and 7 conjugates (being the latter around the threshold limit, Figure S7). This can be related to the drug's binding position that excels fitting in the hCE2 active site when the acetyl-bridged hydroxyl is functionalized. Consequently, the  $\Delta G^{\ddagger}$  associated with TS1 for **6a–c** sums to values around 20.5 kcal mol<sup>-1</sup> (Figure 3). At the intermediate structure, we observed that for 5a-c, the core rings are mostly exposed to the solvent. Few drug interactions with the protein between the methoxy group and the allylic portion of P441 and M341 lie through VdW. For 6a-c and 7a-c, stronger interactions were recorded. The methoxy group

is inserted in a small hydrophobic pocket that is composed of A73, L76, L77, and V126 residues. The sugar moiety of 6a-c interacts weakly with the allylic portion and L452 and via hydrogen bonding with the backbone carbonyl of F81. Additionally, the adjacent hydroxyl interacts with the K440 side chain, which in turn interacts with the carboxylate of D447. Contrarily, the amine function of the sugar moiety of 7a-c is linked to the backbone carbonyl of H448 via a hydrogen bond, and the hydroxyl weakly with the G449 carbonyl. In 7a-c, the F81 side chain interacts with the drug with  $\pi - \pi$  stacking.

The drug release follows the TS2 achievement. For derivatives 5a-b, we obtained a value of more than 29.2 kcal mol<sup>-1</sup>, and 5c requires about 6.0 kcal mol<sup>-1</sup> less (Figure S7). With the bad positioning of the system (Figure S8), both reactions (TS1 and TS2) are hindered to achieve "efficient" barriers. An example of this is highlighted in derivatives 6a-c(Figure 6), where lower barriers were calculated, with a  $\Delta G^*$ of around 21.0 kcal mol<sup>-1</sup> (Figure 3). Meanwhile, for 7a-c, the TS2 has a  $\Delta G^{\ddagger}$  of 25.5 kcal mol<sup>-1</sup> for 7a. This value

D334



Figure 7. Reference structures of the TI1 complexes 9a and 10a (A and B, respectively) retrieved from the 20 ns aMD last frame run. Distances are given in Å.

increases to 28.0 kcal  $mol^{-1}$  in 7b, and 32.4 kcal  $mol^{-1}$  in 7c (Figure 3).

Paclitaxel-Based Conjugates. In the most complex systems that we have tested (paclitaxel derivatives, 8-10, Figure 2), the conjugation of bulky groups and their stereo effects prevented a good accommodation of these moieties in the hCE2 active site, as further explained. In the 8 derivatives, the oxyanion hole residues interact weakly with the negatively charged oxygen. This can be explained by stereo effects performed by bulky groups of the drug that perturb the loop containing the oxyanion residues (e.g., the benzamide and phenyl groups near the functionalized hydroxyl, Figures 2 and S12). These disturbances translate into an unstable TI1 structure that is more than 7.5 kcal mol<sup>-1</sup> (Figure S10) above the RC. In this structure, the PDC's drug portion interacts strongly with the enzyme via VdW forces carried out by L77, F81, L440, and L452 in the methoxy and methyl groups, and M125, V126, L284, L338, L440, and P441 in the aryl groups. The reaction to EAM (Figure S11) requires an enormous amount of energy for the system to reach TS2 (more than 53.8 kcal mol<sup>-1</sup>, Figure S10). This is related to the higher distance between  $O_{drug}$ -H $\varepsilon_{H448}$  and possibly by stereo effects conducted by the oxetane ring that caps the Odrug, hindering their approximation to  $H\varepsilon_{H448}$ .

For the 9a and 10a PDCs, our simulations revealed a distortion of the oxyanion hole loop (Figure 7), where accommodation of these conjugates on the hCE2 active site seems to be problematic. The BzO-NH-Bn set grouped spatially near the functionalized hydroxyl cap (Figures 2 and 7) and perturbed the oxyanion hole loop residues (H120-A128), changing the loop position and inhibiting the interaction of G122 and G123 backbone amides with the negative oxygen atom of the TI1 (Figure 7). To further evaluate this, we performed 20 ns of aMD to test if there was another enzyme conformation within its energetic landscape that would better accommodate the substrate or a possible reorganization of its tridimensional structure after the conjugates are covalently bonded to the enzyme (in a way that the oxyanion hole loop did not significantly change). In this type of enhanced-sampling method, the energetic barriers that separate different system states are shortened, allowing us to improve the conformational space sampling of the system. This simulation showed that the oxyanion hole loop contains the L124 residue next to the two aromatic groups of the BzO-NH-Bn set (Figure 7). During this run, the average distance between the amide hydrogens of G122 and G123 and the substrate's negatively charged oxygen was greater than 5.8 Å.

The closest distance recorded in the simulated time was also greater than the minimum defined for a hydrogen bond (above 3.4 Å), and the amide backbone of A202 was weakly interacting with the negatively charged substrate's oxygen. Despite the distance being on average 2.0 Å (showing a possible hydrogen bond), the angle between these atoms thwarting the hydrogen interaction.

Although we were able to scan the drug release reaction for **8a–c**, the associated energy barriers hinder their catalysis, as the oxyanion hole residues are weakly stabilizing the negative charge for all tested paclitaxel-based conjugates. The oxyanion hole promotes catalysis with the stabilization of the negative charge developed in the tetrahedral intermediates; without this stabilization, the activation energy required would be exorbitant, therefore inhibiting the catalytic reaction.<sup>34</sup> Moreover, the position of the catalytic histidine may play an important role in lowering the energetic barrier as seen for other enzymes and different substrates.<sup>35,36</sup> Therefore, we predict that these conjugates (8–10, Figure 2) may be hardly hydrolyzed by the hCE2 due to a high energetic barrier.

**Polymeric Carrier Release.** The recycling of the enzyme for another PDC activation reaction requires the removal of the polymeric carrier (11, Figure 2), which was left covalently bonded to the S201 side chain after the drug release (Scheme 1). The resulting biocompatible and biodegradable polymeric product will then be excreted from the body.<sup>37</sup>

Several water molecules are able to access the hCE2 active site and are responsible for moving the reaction forward. The  $\Delta G^{\ddagger}$  for the first step of polymer release (TS3) ranges from 15.2 to 18.2 kcal mol<sup>-1</sup> (Figure 8). After the nucleophilic attack and hydrogen transfer to the  $N \varepsilon_{H448}$  atom, the TI2 complex is generated (Figure 9B,E,H). The backbone amides of G122, G123, and A202 are stabilizing the negative charge developed with the nucleophilic attack. The TI2 polymeric chain interacts mostly with hydrophobic residues since the acyl pocket has a more hydrophobic environment (composed mostly of leucine residues) compared to the alcohol pocket.<sup>16</sup> On the other hand, the TI2 hydroxyl unit does not interact with any residue (aside from H448) once it is pointing toward the active site exit. In this structure,  $\mathrm{H}\varepsilon_{\mathrm{H448}}$  shows a preference for interaction with the O<sub>S201</sub> atom compared to O<sub>WAT</sub> (Figure 9B,E,H). This may reflect the stabilization of the **TI2** structure, as the backward reaction (toward the TS3) is, in terms of energy, less costly than moving forward to the products (through TS4, Figure 8). This may also be the reason why 11c has the highest energetic barrier to TS4 ( $\Delta G^{\ddagger}$  of 21.8 kcal  $mol^{-1}$ ). Nevertheless, in all of the cases, the TS4 relative



**Figure 8.** Free energy profiles for the deacylation step of carriers **11b**-c, derived from the PES, and for **11a** from the \*FEL. Relative barriers are given in kcal mol<sup>-1</sup> for **TS3** (**11a**:16.4\*, **11b**:18.2, **11c**:15.2) and **TS4** (**11a**:20.1\*, **11b**:19.8, **11c**:21.8). The FEL maps for **11a** are presented in the Supporting Information (Figure S12).

energy is similar with an average  $\Delta G^*$  of 20.5 kcal mol<sup>-1</sup> (Figure 8). Finally, the polymeric model (deacylation product) is released from the enzyme after the last transition state (TS4) to yield the PC. After this point, the polymeric carrier is released from the hCE2 active site, excreted from the body, and the catalyst is ready for another turnover. The deacylation rate-limiting step is comparable in all three cases (19.8–21.8 kcal mol<sup>-1</sup> for 11a–c, Figure 8) showing that the polymer

elimination from the hCE2 active site does not compromise the continuity of PDC degradation.

#### CONCLUSIONS

We have screened the hCE2 capability to accept and degrade 30 PDCs by means of covalent molecular docking, molecular dynamics, and QM/MM MD calculations. The formation of PDC micellar structures (Figure 1B) can enhance plasma stability and ultimately achieve accumulation in the tumor site. As the hCE2 is overexpressed in tumor cells, selective degradation of those conjugates (prodrug activation) inside them could be expected.

The screened conjugates are composed of an anticancer drug covalently linked to a polymeric carrier through an ester bond. We have tested several hydroxyl functions of each drug to evaluate differences in the free energy barriers for the drug and polymeric carrier release. As an initial screening, we have performed PES scans on the whole reaction mechanism cycle to assess the associated barriers (acylation step: formation of TI1 and EAM structures; deacylation step: formation of TI2 and PC structures, Scheme 1). The most feasible reactions were further characterized by calculating the FEL for those systems, where the rate-limiting step is under the 25.0 kcal  $mol^{-1}$  threshold (Figure 2) and associated with the drug's release. For the acylation step of the best-ranked systems (2a, 4a-b, and 9a-c), we predicted a  $\Delta G^{\ddagger}$  below 23.7 kcal mol<sup>-</sup> where the best-ranked conjugate (4b) has a  $\Delta G^{\ddagger}$  of 20.2 kcal  $mol^{-1}$ .



Figure 9. Active site pocket reference structures of the lowest-energy stationary points EAM, TI2, and PC of 11a (A, B, and C, respectively), 11b (D, E, and F, respectively), and 11c (G, H, and I, respectively), where key distances are given in Å.

Based on the results of this screening, some key aspects can be retrieved to understand the feasibility of designed PDCs capable to suffer hydrolysis by the hCE2: the drug's size in conjugation with a good binding spatial conformation seems to be fundamental. For example, we have captured a gemcitabine candidate (2a, Figure 4) whereas, in all tested paclitaxel conjugates, none were able to achieve an energetic barrier below the defined threshold. In this latter case, it was due to a perturbation of the oxyanion hole that is essential for adequate stabilization of the intermediate's negative charge (Scheme 1). The binding positioning is also displayed on the SN38 (4a–b, Figure 5) and doxorubicin (6a-c, Figure 6) conjugates. As these drugs display a flat core, binding to the hCE2 pocket seems to be facilitated. For the SN38, and in addition to the previous factor, the formation of a secondary structure that implies a "one-way" movement of the negative charge (Scheme 2), sounds for higher energetic barriers as the restoration of the carbonyl function may assist bond breakage. Here, we observed the contrary: bond breakage in the 3 derivatives may assist the movement of the negative charge to the primary oxygen atom  $(O^a, Scheme 2)$ , so the carbonyl can be restored.

Finally, and to ensure that the enzyme was not covalently blocked by the leaving polymeric carrier after drug release, we have also investigated the deacylation phase. We observed a  $\Delta G^{\ddagger}$  below 21.8 kcal mol<sup>-1</sup> associated with the last transition state for the simulated polymeric models, showing the possibility for another turnover in PDC hydrolysis.

Several works delved into the expression of hCE2 in different tissues, and its overexpression in tumor cells.<sup>38-40</sup> By relying on this particular pattern, advanced therapies and delivery systems can use this advantage for better treatment options. Here we have explored this with an array of small drugs already in use for a range of cancer types, enhancing their scope. The engineering of polymeric micelles for their delivery diminishes the probability of off-target effects, which are major drawbacks of current drug therapies. Furthermore, the activation of those (pro)drugs only upon tumor cell entry and localization allows for an increased therapeutic effect with smaller doses, preventing the need for large amounts of raw materials for the fabrication of these medicines by industries, while allowing patients to develop fewer side effects and enhancing drugs' effectiveness. By expanding the scope of viable PDCs, we are contributing to the solution of one of the most urgent health issues of today's society that is to ensure effective cancer treatments while lowering side effects that are a consequence of the administration mode, formulation, and status of the drugs, self-guarding healthy lives and promoting well-being for all.

#### METHODS

**Initial Setup.** The hCE2 structure was previously modeled and reported by our group, where detailed information regarding the modeling procedure can be found.<sup>20</sup> The model was built using Modeller v9.24<sup>41</sup> followed by cMD (100 ns) prior to aMD (50 ns) to obtain the enzyme's active form. Our model is in high agreement with the one concomitantly reported in the  $\alpha$  Fold database,<sup>42</sup> with only 0.3 Å of RMSD (C $\alpha$ , excluding the N- and C- terminal ends).<sup>20</sup> The protonation state residues of the hCE2 were assigned considering an aqueous solution with physiological pH (7.4).<sup>43</sup> The TI1 and TI2 residues were geometry-optimized in Gaussian09<sup>44</sup> using B3LYP<sup>32</sup> with the 6-31G(d,p) basis set in the gas phase. The atomic partial charges were calculated for TI1 and TI2 according to the RESP methodology.<sup>45,46</sup>

**Molecular Docking.** The initial position of the **TI1** structures was obtained by the flexible side-chain covalent docking method,<sup>47</sup> performed with the AutoDock4.2 suite of programs, using the LGA.<sup>48</sup> A total of 150 runs were carried out. The population was set to 300, the maximum number of generations to 27,000, and the maximum number of energy evaluations to 2,500,000. The best-ranked result was selected, where the polymeric unit and drug are placed in the correct pocket and subjected to MD simulations.

Molecular Dynamics. The cMD and aMD simulations were performed using the AMBER18<sup>49</sup> with the parm99SB<sup>50</sup> and GAFF<sup>51</sup> force fields. The structures were placed within a preequilibrated octahedral box of TIP3P waters<sup>52</sup> (10.0 Å distance between the surface of the protein to the box) with 6 Na<sup>+</sup> ions to neutralize the system. Two initial energy minimizations and 500 ps of equilibration were carried out in an NVT ensemble using Langevin dynamics with small restraints of 10.0 kcal mol<sup>-1</sup> on the protein, to heat the systems; 5 ns production simulations were carried out at 310.15 K in an NPT ensemble using the Langevin dynamics with a collision frequency of 1 ps<sup>-1</sup>. Constant pressure periodic boundary conditions were imposed with an average pressure of 1 atm. Isotropic position scaling was used to maintain pressure with a relaxation time of 2 ps, and the time step was set to 2 fs. SHAKE constraints were applied to all bonds involving hydrogen atoms.<sup>53</sup> The PME method<sup>34</sup> was used to calculate electrostatic interactions with a cutoff distance of 10.0 Å. The aMD simulations were conducted for 20 ns per complex and the parameters were selected based on the system size, average dihedral, and potential energy.<sup>55</sup> These parameters are provided in Table S1.

**Quantum Mechanics/Molecular Mechanics Calculations.** The QM/MM Umbrella Sampling calculations<sup>56–58</sup> were performed using the internal semiempirical hybrid QM/MM functionality implemented in AMBER18<sup>49</sup> with periodic boundary conditions. The last cMD reference structure of each complex was used as the initial structure for the QM/MM calculations. The PM3 semiempirical method<sup>59,60</sup> was employed to describe the QM region, while the MM region was described by the Amber parm99SB force field.<sup>50</sup> Reactions were conducted at physiological temperature (310.15 K). Electrostatic embedding<sup>61</sup> was employed and the boundary was treated via the link atom approach. Long-range electrostatic interactions were described by an adapted implementation of the PME method<sup>54</sup> for QM/MM.<sup>62</sup>

For the PES and FEL scans, the same combination of atoms representing the reaction coordinates was used (Figures S13 and S14): (i) the distance between  $H\epsilon_{H448}$ - $O_{S201}$  ( $\theta$ ) connected to  ${
m O}_{
m S201}-{
m C}_{
m T}$  ( $\omega$ ) and (ii) the distance between  ${
m H}arepsilon_{
m H448}-{
m O}_{
m drug}$  ( $\phi$ ) connected to  $O_{drug}-C_T$  ( $\sigma$ ). In PES, the reaction coordinates (distance between  $H_{\mathcal{E}_{H448}}$  and  $O_{S201}$  ( $\theta$ ) or  $O_{drug}$  ( $\phi$ ), Figure S13) were restrained in 0.1 Å steps using the umbrella sampling method, except near the transition states where smaller 0.02 Å steps were employed, with an umbrella constraint force of 200 kJ mol<sup>-1</sup> Å<sup>-2</sup>. For every window, a total of 50 ps were simulated with a time step of 1 fs. For the FEL, and in accordance with our previous work,  $^{20,35}$  the structures from PES were used as starting points. To keep the reaction coordinates at the requested distances and to ensure enough overlap between windows, an umbrella constraint force of 200 kJ mol<sup>-1</sup> A<sup>-</sup> was used along the reaction path and incrementally increased to 1000 kJ mol<sup>-1</sup> A<sup>-2</sup> as the reaction coordinates deflect from the minimumenergy path. For every window, a total of 20 ps was simulated with a time step of 1 fs and the distances scanned from 1.4 to 2.5 Å ( $\omega$  and  $\sigma$ , Figure S13) and from 1.0 to 2.0 Å ( $\theta$  and  $\phi$ , Figure S13), comprising a total of 132 simulations per step. The free energy profiles were obtained by combining all of the statistics from each reaction simulation by resorting to WHAM with the Monte Carlo bootstrap error analysis.<sup>63,64</sup> The minimum-energy path was traced with the MEPSA software v1.4,65 and all of the averaged minima structures were retrieved and optimized with PM6/parm99SB to make all of the figures.

**Density Functional Theory Corrections.** For the high-level layer corrections, we resorted to a method described in ref 66, which is based on the work of Truhlar and co-workers.<sup>67,68</sup> This method compensates for the limitations of semiempirical methods. Multiple

structures of the QM region (with H link atoms) were extracted and submitted to single-point energy calculations in the gas phase. Structures were extracted along the reaction path (for PES) and from the whole potential of mean force (for FEL). The calculations were carried out in ORCA software v5.0.1,<sup>69</sup> with the semiempirical PM3<sup>59,60</sup> and B3LYP-D3/6-31++G(d,p).<sup>32,33</sup> The corrected energy term ( $E_{corr}$ ) was interpolated from those structures employing eq 1

$$E_{\rm corr} = E_{\rm MM}^{\rm PM3} + S(\Delta E_{\rm PM3}^{\rm B3LYP})$$
(1)

where the term  $\Delta E_{\rm PM3}^{\rm B3LYP}$  corresponds to the difference between the free energy for the high-level layer set, calculated with B3LYP-D3/6-31++G(d,p)^{32,33} and PM3,^{59,60} while S represents the cubic spline function of the difference between the high-level and low-level theories representing the QM region.

#### ASSOCIATED CONTENT

#### **Supporting Information**

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acs.jmedchem.2c01781.

PES profiles for PDCs 1a-c and 2b-c (Figure S1), 3a-c and 4b-c (Figure S2), 5a-c, 6a-c, and 7a-c (Figure S7), 8b-c (Figure S10); FEL maps for PDCs 2a (Figure S1), 4a-b (Figure S4), 6a-c (Figure S7), 11a (Figure S12); active site reference structures for the stationary points of 1a-c (Figure S2), 2b-c (Figure S3), 3a-c (Figure S5), 4c (Figure S6), 5a-c (Figure S8), 7a-c (Figure S9), 8b-c (Figure S11); aMD parameters (Table S1); general QM region selected (Figure S13); and full representation of the selected QM region (Figure S14) (PDF) PDB database (ZIP)

#### AUTHOR INFORMATION

#### **Corresponding Author**

Alexandra T. P. Carvalho – CNC – Center for Neuroscience and Cell Biology, Institute for Interdisciplinary Research (IIIUC), University of Coimbra, 3004-504 Coimbra, Portugal; Department of Biocatalysis and Isotope Chemistry, Almac Sciences, Craigavon BT63 SQD Northern Ireland, United Kingdom; • orcid.org/0000-0003-2827-5527; Email: atpcarvalho@uc.pt

#### Authors

- Pedro R. Figueiredo CNC Center for Neuroscience and Cell Biology, Institute for Interdisciplinary Research (IIIUC), University of Coimbra, 3004-504 Coimbra, Portugal; PhD Programme in Experimental Biology and Biomedicine, Institute for Interdisciplinary Research (IIIUC), University of Coimbra, 3030-789 Coimbra, Portugal; orcid.org/0000-0002-1243-0265
- Ricardo D. González CNC Center for Neuroscience and Cell Biology, Institute for Interdisciplinary Research (IIIUC), University of Coimbra, 3004-504 Coimbra, Portugal; PhD Programme in Experimental Biology and Biomedicine, Institute for Interdisciplinary Research (IIIUC), University of Coimbra, 3030-789 Coimbra, Portugal; © orcid.org/0000-0003-1706-6092

Complete contact information is available at: https://pubs.acs.org/10.1021/acs.jmedchem.2c01781

#### **Author Contributions**

PRF methodology, investigation, and image conceptualization. P.R.F and A.T.P.C.: formal analysis and results interpretation. A.T.P.C.: validation and research supervision. P.R.F., R.D.G., and A.T.P.C.: manuscript writing, editing, and revision.

#### Funding

This work was sponsored through grants SFRH/BD/144303/ 2019, 2020.10114.BD, and IF/01272/2015, and project UIDB/04539/2020 financed by Portuguese National funds via FCT–Fundação para a Ciência e a Tecnologia and Regional Operational Program Centro (CENTRO2020) under the Portuguese Partnership Agreement 2020 by the European Regional Development Fund (ERDF).

#### Notes

The authors declare no competing financial interest.

#### ACKNOWLEDGMENTS

The authors acknowledge the computing resources made available by the Minerva HPC from the Coimbra Institute of Engineering (ISEC) and by the National Distributed Computing Infrastructure (INCD), funded by FCT and FEDER under the projects 01/SAICT/2016 no. 022153 and Advanced Computing Project CPCA/A2/4568/2020.

#### ABBREVIATIONS USED

AMBER18, Amber molecular dynamics program; aMD, accelerated molecular dynamics; cMD, conventional molecular dynamics; EAM, enzyme-acyl monomer; FES, free energy surface; GAFF, general Amber force field; hCE, human carboxylesterase; HF, Hartree–Fock; LGA, Lamarckian genetic algorithm; MD, molecular dynamics; MM, molecular mechanics; NP, nanoparticle; PC, product complex; PCL, poly(caprolactone); PDC, polymer–drug conjugates; PES, potential energy surface; PGA, poly(glycolic acid); PLA, poly(lactic acid); PME, particle mesh Ewald; QM, quantum mechanics; QM/MM, quantum mechanics/molecular mechanics; RC, reactant complex; RESP, restrained electrostatic potential; TI, tetrahedral Intermediate; TS, transition state; VdW, Van der Waals; WHAM, weighted histogram analysis method

#### REFERENCES

(1) Sung, H.; Ferlay, J.; Siegel, R. L.; Laversanne, M.; Soerjomataram, I.; Jemal, A.; Bray, F. Global Cancer Statistics 2020: GLOBOCAN Estimates of Incidence and Mortality Worldwide for 36 Cancers in 185 Countries. *CA-Cancer J. Clin.* **2021**, *71*, 209– 249.

(2) Maeda, H.; Khatami, M. Analyses of Repeated Failures in Cancer Therapy for Solid Tumors: Poor Tumor-selective Drug Delivery, Low Therapeutic Efficacy and Unsustainable Costs. *Clin. Trans. Med.* **2018**, 7, e11.

(3) Bukowski, K.; Kciuk, M.; Kontek, R. Mechanisms of Multidrug Resistance in Cancer Chemotherapy. *Int. J. Mol. Sci.* 2020, *21*, 3233.
(4) Khan, I.; Saeed, K.; Khan, I. Nanoparticles: Properties, Applications and Toxicities. *Arabian J. Chem.* 2019, *12*, 908–931.

(5) Trivedi, R.; Kompella, U. B. Nanomicellar Formulations for Sustained Drug Delivery: Strategies and Underlying Principles. *Nanomedicine* **2010**, *5*, 485–505.

(6) Lu, Z.-R.; Qiao, P. Drug Delivery in Cancer Therapy, Quo Vadis? *Mol. Pharm.* 2018, 15, 3603–3616.

(7) Zheng, X.; Xie, J.; Zhang, X.; Sun, W.; Zhao, H.; Li, Y.; Wang, C. An Overview of Polymeric Nanomicelles in Clinical Trials and on the Market. *Chin. Chem. Lett.* **2021**, *32*, 243–257.

(8) Mundekkad, D.; Cho, W. C. Nanoparticles in Clinical Translation for Cancer Therapy. *Int. J. Mol. Sci.* **2022**, 23, 1685.

(9) Casey Laizure, S.; Herring, V.; Hu, Z.; Witbrodt, K.; Parker, R. B. The Role of Human Carboxylesterases in Drug Metabolism: Have We Overlooked Their Importance? *Pharmacotherapy* **2013**, *33*, 210–222. (10) Satoh, T.; Hosokawa, M. Structure, Function and Regulation of Carboxylesterases. *Chem. - Biol. Interact.* **2006**, *162*, 195–211.

(11) Yan, B. Carboxylesterases. In *Encyclopedia of Drug Metabolism and Interactions*; John Wiley & Sons, Inc.: Hoboken, NJ, USA, 2012; p edm014 DOI: 10.1002/9780470921920.edm014.

(12) Sanghani, S. P.; Sanghani, P. C.; Schiel, M. A.; Bosron, W. F. Human Carboxylesterases: An Update on CES1, CES2 and CES3. *Protein Pep. Lett.* **2009**, *16*, 1207–1214.

(13) Wang, D.; Zou, L.; Jin, Q.; Hou, J.; Ge, G.; Yang, L. Human Carboxylesterases: A Comprehensive Review. *Acta Pharm. Sin. B* **2018**, *8*, 699–712.

(14) Wang, D.-D.; Zou, L.-W.; Jin, Q.; Hou, J.; Ge, G.-B.; Yang, L. Recent Progress in the Discovery of Natural Inhibitors against Human Carboxylesterases. *Fitoterapia* **2017**, *117*, 84–95.

(15) Xu, Y.; Zhang, C.; He, W.; Liu, D. Regulations of Xenobiotics and Endobiotics on Carboxylesterases: A Comprehensive Review. *Eur. J. Drug Metab. Pharmacokinet* **2016**, *41*, 321–330.

(16) Pratt, S. E.; Durland-Busbice, S.; Shepard, R. L.; Heinz-Taheny, K.; Iversen, P. W.; Dantzig, A. H. Human Carboxylesterase-2 Hydrolyzes the Prodrug of Gemcitabine (LY2334737) and Confers Prodrug Sensitivity to Cancer Cells. *Clin. Cancer Res.* **2013**, *19*, 1159–1168.

(17) Quinney, S. K.; Sanghani, S. P.; Davis, W. I.; Hurley, T. D.; Sun, Z.; Murry, D. J.; Bosron, W. F. Hydrolysis of Capecitabine to 5'-Deoxy-5-Fluorocytidine by Human Carboxylesterases and Inhibition by Loperamide. *J Pharmacol. Exp. Ther.* **2005**, *313*, 1011–1016.

(18) Sanghani, S. P.; Quinney, S. K.; Fredenburg, T. B.; Davis, W. I.; Murry, D. J.; Bosron, W. F. Hydrolysis of Irinotecan and Its Oxidative Metabolites, 7-Ethyl-10-[4-N-(5-Aminopentanoic Acid)-1-Piperidino] Carbonyloxycamptothecin and 7-Ethyl-10-[4-(1-Piperidino)-1-Amino]-Carbonyloxycamptothecin, by Human Carboxylesterases CES1A1, CES2, and a Newly Expressed Carboxylesterase Isoenzyme, CES3. Drug Metab. Dispos. **2004**, *32*, 505–511.

(19) Barthel, B. L.; Torres, R. C.; Hyatt, J. L.; Edwards, C. C.; Hatfield, M. J.; Potter, P. M.; Koch, T. H. Identification of Human Intestinal Carboxylesterase as the Primary Enzyme for Activation of a Doxazolidine Carbamate Prodrug. *J. Med. Chem.* 2008, *51*, 298–304.
(20) Figueiredo, P. R.; González, R. D.; Carvalho, A. T. P. Human Carboxylesterase 2 in Cocaine Metabolism. *Mol. Catal.* 2021, *515*, No. 111938.

(21) Hatfield, M.; Tsurkan, L.; Hyatt, J.; Yu, X.; Edwards, C.; Hicks, L.; Wadkins, R.; Potter, P. Biochemical and Molecular Analysis of Carboxylesterase-Mediated Hydrolysis of Cocaine and Heroin: Carboxylesterase Hydrolysis of Cocaine and Heroin. *Br. J. Pharmacol.* **2010**, *160*, 1916–1928.

(22) Gunatillake, P. A.; Adhikari, R. Biodegradable Synthetic Polymers for Tissue Engineering. *Eur. Cell. Mater.* **2003**, *5*, 1–16.

(23) Li, Y.; Li, P.; Li, Y.; Zhang, R.; Yu, P.; Ma, Z.; Kainov, D. E.; de Man, R. A.; Peppelenbosch, M. P.; Pan, Q. Drug Screening Identified Gemcitabine Inhibiting Hepatitis E Virus by Inducing Interferon-like Response via Activation of STAT1 Phosphorylation. *Antiviral Res.* **2020**, *184*, No. 104967.

(24) Lei, H.; Wang, X.; Wu, C. Early Stage Intercalation of Doxorubicin to DNA Fragments Observed in Molecular Dynamics Binding Simulations. *J. Mol. Graphics Modell.* **2012**, *38*, 279–289.

(25) Kawato, Y.; Aonuma, M.; Hirota, Y.; Kuga, H.; Sato, K. Intracellular Roles of SN-38, a Metabolite of the Camptothecin Derivative CPT-11, in the Antitumor Effect of CPT-11. *Cancer Res.* **1991**, *51*, 4187–4191.

(26) Fugit, K. D.; Anderson, B. D. The Role of PH and Ring-Opening Hydrolysis Kinetics on Liposomal Release of Topotecan. J. Control. Release 2014, 174, 88–97.

(27) Singh, R.; Kumari, P.; Kumar, S. Nanotechnology for Enhanced Bioactivity of Bioactive Phytomolecules. In *Nutrient Delivery*; Elsevier, 2017; pp 413–456 DOI: 10.1016/B978-0-12-804304-2.00011-1.

(28) Padmanabhan, S. *Handbook of Pharmacogenomics and Stratified Medicine;* Academic Press, 2014.

pubs.acs.org/jmc

(29) Nussbaumer, S.; Bonnabry, P.; Veuthey, J.-L.; Fleury-Souverain, S. Analysis of Anticancer Drugs: A Review. *Talanta* **2011**, *85*, 2265–2289.

(30) Sikes, R. A. Chemistry and Pharmacology of Anticancer Drugs. Br. J. Cancer 2007, 97, 1713.

(31) Zhang, J. A.; Xuan, T.; Parmar, M.; Ma, L.; Ugwu, S.; Ali, S.; Ahmad, I. Development and Characterization of a Novel Liposome-Based Formulation of SN-38. *Int. J. Pharm.* **2004**, *270*, 93–107.

(32) Ashvar, C. S.; Devlin, F. J.; Bak, K. L.; Taylor, P. R.; Stephens, P. J. Ab Initio Calculation of Vibrational Absorption and Circular Dichroism Spectra: 6,8-Dioxabicyclo[3.2.1]Octane. *J. Phys. Chem. A* **1996**, *100*, 9262–9270.

(33) Grimme, S.; Antony, J.; Ehrlich, S.; Krieg, H. A Consistent and Accurate Ab Initio Parametrization of Density Functional Dispersion Correction (DFT-D) for the 94 Elements H-Pu. *J. Chem. Phys.* 2010, 132, No. 154104.

(34) Simón, L.; Goodman, J. M. Enzyme Catalysis by Hydrogen Bonds: The Balance between Transition State Binding and Substrate Binding in Oxyanion Holes. J. Org. Chem. **2010**, *75*, 1831–1840.

(35) Figueiredo, P. R.; Almeida, B. C.; Dourado, D. F. A. R.; Sousa, A. F.; Silvestre, A. J. D.; Carvalho, A. T. P. Enzymatic Synthesis of Poly(Caprolactone): A QM/MM Study. *ChemCatChem* **2020**, *12*, 4845–4852.

(36) Figueiredo, P.; Almeida, B. C.; Carvalho, A. T. P. Enzymatic Polymerization of PCL-PEG Co-Polymers for Biomedical Applications. *Front. Mol. Biosci.* **2019**, *6*, 109.

(37) Halka, A. T.; Kielty, C.; Walker, M. G. Vascular Tissue Engineering. In *Biomaterials and Devices for the Circulatory System*; Elsevier, 2010; pp 309–365 DOI: 10.1533/9780857090553.3.309.

(38) Yano, H.; Kayukawa, S.; Iida, S.; Nakagawa, C.; Oguri, T.; Sanda, T.; Ding, J.; Mori, F.; Ito, A.; Ri, M.; Inagaki, A.; Kusumoto, S.; Ishida, T.; Komatsu, H.; Inagaki, H.; Suzuki, A.; Ueda, R. Overexpression of Carboxylesterase-2 Results in Enhanced Efficacy of Topoisomerase I Inhibitor, Irinotecan (CPT-11), for Multiple Myeloma. *Cancer Sci.* **2008**, *99*, 2309–2314.

(39) Basit, A.; Neradugomma, N. K.; Wolford, C.; Fan, P. W.; Murray, B.; Takahashi, R. H.; Khojasteh, S. C.; Smith, B. J.; Heyward, S.; Totah, R. A.; Kelly, E. J.; Prasad, B. Characterization of Differential Tissue Abundance of Major Non-CYP Enzymes in Human. *Mol. Pharmaceutics* **2020**, *17*, 4114–4124.

(40) Zhang, M.-m.; Li, P.; Hai, F.; Jia, Y. Determination of Carboxylesterase 2 by Fluorescence Probe to Guide Pancreatic Adenocarcinoma Profiling. *Chem. Phys. Lett.* **2021**, *785*, No. 139143. (41) Webb, B.; Sali, A. Comparative Protein Structure Modeling Using MODELLER. *Curr. Protoc. Bioinform.* **2016**, *54*, 5.6.1–5.6.37. (42) Jumper, J.; Evans, R.; Pritzel, A.; Green, T.; Figurnov, M.; Ronneberger, O.; Tunyasuvunakool, K.; Bates, R.; Žídek, A.; Potapenko, A.; Bridgland, A.; Meyer, C.; Kohl, S. A. A.; Ballard, A. J.; Cowie, A.; Romera-Paredes, B.; Nikolov, S.; Jain, R.; Adler, J.; Back, T.; Petersen, S.; Reiman, D.; Clancy, E.; Zielinski, M.; Steinegger, M.; Pacholska, M.; Berghammer, T.; Bodenstein, S.; Silver, D.; Vinyals, O.; Senior, A. W.; Kavukcuoglu, K.; Kohli, P.; Hassabis, D. Highly Accurate Protein Structure Prediction with AlphaFold. *Nature* **2021**, *596*, 583–589.

(43) Hopkins, E.; Sanvictores, T.; Sharma, S. Physiology, Acid Base Balance. In *StatPearls*; StatPearls Publishing: Treasure Island (FL), 2021.

(44) Frisch, M. J.; Trucks, G. W.; Cheeseman, J. R.; Scalmani, G.; Caricato, M.; Hratchian, H. P.; Li, X.; Barone, V.; Bloino, J.; Zheng, G.; Vreven, T.; Montgomery, J. A.; Petersson, G. A.; Scuseria, G. E.; Schlegel, H. B.; Nakatsuji, H.; Izmaylov, A. F.; Martin, R. L.; Sonnenberg, J. L.; Peralta, J. E.; Heyd, J. J.; Brothers, E.; Ogliaro, F.; Bearpark, M.; Robb, M. A.; Mennucci, B.; Kudin, K. N.; Staroverov, V. N.; Kobayashi, R.; Normand, J.; Rendell, A.; Gomperts, R.; Zakrzewski, V. G.; Hada, M.; Ehara, M.; Toyota, K.; Fukuda, R.; Hasegawa, J.; Ishida, M.; Nakajima, T.; Honda, Y.; Kitao, O.; Nakai, H. *Gaussian 09*; Revision B.01, Gaussian, Inc.: Wallingford CT, 2009. (45) Tomasi, J.; Mennucci, B.; Cammi, R. Quantum Mechanical

Continuum Solvation Models. *Chem. Rev.* 2005, *105*, 2999–3094. (46) Bayly, C. I.; Cieplak, P.; Cornell, W.; Kollman, P. A. A Well-Behaved Electrostatic Potential Based Method Using Charge Restraints for Deriving Atomic Charges: The RESP Model. *J. Phys. Chem. B* 1993, *97*, 10269–10280.

(47) Bianco, G.; Forli, S.; Goodsell, D. S.; Olson, A. J. Covalent Docking Using Autodock: Two-Point Attractor and Flexible Side Chain Methods: Covalent Docking with AutoDock. *Protein Sci.* **2016**, *25*, 295–301.

(48) Morris, G. M.; Huey, R.; Lindstrom, W.; Sanner, M. F.; Belew, R. K.; Goodsell, D. S.; Olson, A. J. AutoDock4 and AutoDockTools4: Automated Docking with Selective Receptor Flexibility. *J. Comput. Chem.* **2009**, *30*, 2785–2791.

(49) Salomon-Ferrer, R.; Case, D. A.; Walker, R. C. An Overview of the Amber Biomolecular Simulation Package: Amber Biomolecular Simulation Package. *Wiley Interdiscip. Rev.: Comput. Mol. Sci.* **2013**, *3*, 198–210.

(50) Hornak, V.; Abel, R.; Okur, A.; Strockbine, B.; Roitberg, A.; Simmerling, C. Comparison of Multiple AMBER Force Fields and Development of Improved Protein Backbone Parameters. *Proteins* **2006**, *65*, 712–725.

(51) Wang, J.; Wolf, R. M.; Caldwell, J. W.; Kollman, P. A.; Case, D. A. Development and Testing of a General Amber Force Field. *J. Comput. Chem.* **2004**, *25*, 1157–1174.

(52) Salomon-Ferrer, R.; Case, D. A.; Walker, R. C. An Overview of the Amber Biomolecular Simulation Package. *Wiley Interdiscip. Rev. Comput. Mol. Sci.* 2013, *3*, 198–210.

(53) Ryckaert, J.-P.; Ciccotti, G.; Berendsen, H. J. C. Numerical Integration of the Cartesian Equations of Motion of a System with Constraints: Molecular Dynamics of n-Alkanes. *J. Comput. Phys.* **1977**, 23, 327–341.

(54) Darden, T.; York, D.; Pedersen, L. Particle Mesh Ewald: An N-log(N) Method for Ewald Sums in Large Systems. *J. Chem. Phys.* **1998**, 10089–10092.

(55) Wereszczynski, J.; McCammon, J. A. Accelerated Molecular Dynamics in Computational Drug Design. In *Computational Drug Discovery and Design. Methods in Molecular Biology*; Baron, R., Ed.; Springer New York: New York, NY, 2012; Vol. 819, pp 515–524 DOI: 10.1007/978-1-61779-465-0\_30.

(56) Warshel, A.; Levitt, M. Theoretical Studies of Enzymic Reactions: Dielectric, Electrostatic and Steric Stabilization of the Carbonium Ion in the Reaction of Lysozyme. *J. Mol. Biol.* **1976**, *103*, 227–249.

(57) Carvalho, A. T. P.; Barrozo, A.; Doron, D.; Kilshtain, A. V.; Major, D. T.; Kamerlin, S. C. L. Challenges in Computational Studies of Enzyme Structure, Function and Dynamics. *J. Mol. Graph. Model.* **2014**, *54*, 62–79.

(58) Torrie, G. M.; Valleau, J. P. Nonphysical Sampling Distributions in Monte Carlo Free-Energy Estimation: Umbrella Sampling. *J. Comput. Phys.* **1977**, *23*, 187–199.

(59) Stewart, J. J. P. Optimization of Parameters for Semiempirical Methods V: Modification of NDDO Approximations and Application to 70 Elements. *J. Mol. Model.* **200**7, *13*, 1173–1213.

(60) Jindal, G.; Warshel, A. Exploring the Dependence of QM/MM Calculations of Enzyme Catalysis on the Size of the QM Region. *J. Phys. Chem. B* **2016**, *120*, 9913–9921.

(61) Bakowies, D.; Thiel, W. Hybrid Models for Combined Quantum Mechanical and Molecular Mechanical Approaches. J. Phys. Chem. C 1996, 100, 10580–10594.

(62) Nam, K.; Gao, J.; York, D. M. An Efficient Linear-Scaling Ewald Method for Long-Range Electrostatic Interactions in Combined QM/ MM Calculations. J. Chem. Theory Comput. **2005**, *1*, 2–13.

(63) Kumar, S.; Rosenberg, J. M.; Bouzida, D.; Swendsen, R. H.; Kollman, P. A. THE Weighted Histogram Analysis Method for Free-Energy Calculations on Biomolecules. I. The Method. *J. Comput. Chem.* **1992**, *13*, 1011–1021.

(64) Grossfield, A. An Implementation of WHAM: The Weighted Histogram Analysis Method. Version 2.0.9, 2018, p 18.

(65) Marcos-Alcalde, I.; Setoain, J.; Mendieta-Moreno, J. I.; Mendieta, J.; Gómez-Puertas, P. MEPSA: Minimum Energy Pathway Analysis for Energy Landscapes: Figure 1. *Bioinformatics* **2015**, No. btv453.

pubs.acs.org/jmc

(66) Ruiz-Pernía, J. J.; Silla, E.; Tuñón, I.; Martí, S.; Moliner, V. Hybrid QM/MM Potentials of Mean Force with Interpolated Corrections. J. Phys. Chem. B **2004**, 108, 8427–8433.

(67) Chuang, Y.-Y.; Corchado, J. C.; Truhlar, D. G. Mapped Interpolation Scheme for Single-Point Energy Corrections in Reaction Rate Calculations and a Critical Evaluation of Dual-Level Reaction Path Dynamics Methods. *J. Phys. Chem. A* **1999**, *103*, 1140–1149.

(68) Nguyen, K. A.; Rossi, I.; Truhlar, D. G. A Dual-level Shepard Interpolation Method for Generating Potential Energy Surfaces for Dynamics Calculations. J. Chem. Phys. **1995**, 103, 5522-5530.

(69) Neese, F.; Wennmohs, F.; Becker, U.; Riplinger, C. The ORCA Quantum Chemistry Program Package. *J. Chem. Phys.* **2020**, *152*, No. 224108.

### **Recommended by ACS**

Molecular Design and Controlled Self-Assembly of Copolymers as Core-Shell-Corona Nanoparticles for Smarter Tumor Treatment

Peng Liu. JANUARY 03, 2024 LANGMUIR

READ 🗹

#### Construction of Core-Cross-Linked Polymer Micelles with High Biocompatibility and Stability for pH/Reduction Controllable Drug Delivery

Yehong Liu, Honglai Liu, et al. AUGUST 30, 2023 LANGMUIR

READ 🗹

# Block Copolymer Encapsulation of Disarib, an Inhibitor of BCL2 for Improved Chemotherapeutic Potential

Reshma Joy, Jinu George, *et al.* OCTOBER 19, 2023

ACS OMEGA

READ 🗹

#### Synthesis and Characterization of Linear Polyglycidol Derivatives: Surface Activity and Potential for Advanced Doxorubicin Delivery Application

Yusi Li, Lei Hu, et al. AUGUST 28, 2023 ACS APPLIED POLYMER MATERIALS

Get More Suggestions >