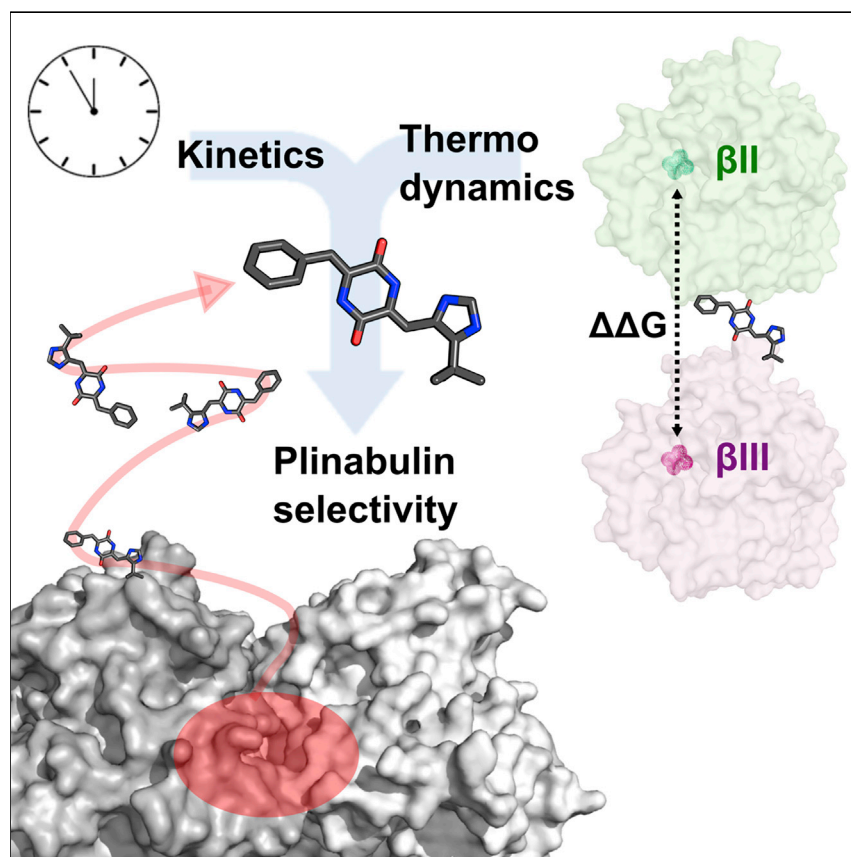


## Article

## Structure, Thermodynamics, and Kinetics of Plinabulin Binding to Two Tubulin Isootypes



Plinabulin is a novel tubulin-binding agent that is currently in phase 3 clinical trials for cancer treatment and prevention of chemotherapy-induced neutropenia. Plinabulin binds within a distinct tubulin pocket, which differentiates it from other tubulin binders. Aimed at disclosing structural and energetic details of plinabulin binding to tubulin, we combine X-ray crystallography and computational modeling. We compare the plinabulin residence time with that of colchicine and combretastatin-A4. Our study helps understand potential mechanisms underlying differential effects of this family of anti-tubulin drugs.

Giuseppina La Sala, Natacha Olieric, Ashwani Sharma, ..., José Fernando Díaz, Michel O. Steinmetz, Andrea Cavalli

michel.steinmetz@psi.ch (M.O.S.)  
andrea.cavalli@iit.it (A.C.)

## HIGHLIGHTS

Plinabulin is a phase 3 anticancer and antineutropenia drug candidate

Plinabulin binding to tubulin differentiates it from other compounds

We report crystal structures of plinabulin in complex with  $\beta$ II- and  $\beta$ III-tubulin isotypes

We performed thermodynamic and kinetic studies on plinabulin selectivity and mechanism of action

Article

# Structure, Thermodynamics, and Kinetics of Plinabulin Binding to Two Tubulin Isoforms

Giuseppina La Sala,<sup>1,2,8,9</sup> Natacha Olieric,<sup>3,9</sup> Ashwani Sharma,<sup>3,9</sup> Federica Viti,<sup>1</sup> Francisco de Asis Balaguer Perez,<sup>4</sup> Lan Huang,<sup>5</sup> James R. Tonra,<sup>5</sup> G. Kenneth Lloyd,<sup>5</sup> Sergio Decherchi,<sup>1,2</sup> José Fernando Díaz,<sup>4</sup> Michel O. Steinmetz,<sup>3,6,\*</sup> and Andrea Cavalli<sup>1,7,10,\*</sup>

## SUMMARY

$\alpha\beta$ -Tubulin is a validated target for anticancer drug discovery, and molecules binding to this protein are used to treat several types of tumors. Here, we report on a combined X-ray crystallography and molecular dynamics approach to study drug binding within the colchicine site of  $\alpha\beta$ -tubulin, focusing on plinabulin, an agent currently in phase 3 clinical testing for the treatment of cancer and chemotherapy-induced neutropenia. We found that plinabulin is more persistently bound to the colchicine site of  $\beta$ II- compared to  $\beta$ III-tubulin, allowing for a prediction of isotype-expression-dependent drug sensitivity. Additionally, computational residence time and exit paths from the  $\beta$ II-tubulin were compared between plinabulin and two other compounds, colchicine and combretastatin-A4. The former displayed the highest residence time, followed by plinabulin and then distantly by combretastatin-A4. Our combined experimental and computational protocol could help to investigate anti-tubulin drugs, improving our understanding of their mechanism of action, residence time, and tubulin isotype selectivity.

## INTRODUCTION

Microtubule-targeting agents (MTAs) are the focus of intense research aiming to improve the treatment of cancer (reviewed in Dumontet and Jordan, 2010<sup>1</sup>). MTAs can be broadly divided into two classes based on their activities toward microtubules at high concentrations: microtubule-stabilizing agents and microtubule-destabilizing agents. In the past few years, structural studies on a plethora of tubulin- and microtubule-MTA complexes have led to the identification and characterization of six different drug binding sites on the  $\alpha\beta$ -tubulin heterodimer (reviewed in Steinmetz and Prota, 2018<sup>2</sup>). Among them, the colchicine site that is located mostly on the  $\beta$ -tubulin subunit is one of the most versatile sites that interact with a wide variety of very potent ligands belonging to different chemical classes (reviewed in Li et al., 2017<sup>3</sup>). Despite extensive efforts and the discovery of multiple agents, an anticancer drug targeting the colchicine site has not yet reached the market through demonstration of an acceptable risk-benefit profile. A better understanding of the combined structural and kinetic features of binding to the colchicine site for these agents may direct future development in a direction more likely to demonstrate significant efficacy with acceptable tolerability.

It is well known that human cells express different  $\alpha\beta$ -tubulin isoforms encoded by several  $\alpha$ - and  $\beta$ -tubulin genes. One widely recognized resistance mechanism that

## The Bigger Picture

Combating cancer is one of the biggest challenges for improving good health and well-being. Novel anticancer drug candidates have been approved over the last few years, yet many cancers remain as unmet medical needs. Achieving a superior understanding of the molecular mechanism of anticancer drugs is key for designing and developing better compounds in terms of potency and safety profiles. Structural biology and computational studies can help remarkably to investigate the mechanism of action of anticancer drugs. Here, we combine X-ray crystallography with molecular dynamics to investigate structural and energetic properties of drug candidates binding to tubulin, a validated target for the discovery of anticancer medicines. In particular, we study plinabulin, colchicine, and combretastatin-A4, analyzing their mechanism of binding to tubulin, which potentially explains their different functional and safety profiles. We further provide a protocol to study novel tubulin-targeted drugs.

has emerged for MTAs is the upregulation of specific tubulin isotypes by cancer cells, in particular  $\beta$ III-tubulin,<sup>4</sup> although in the case of Taxol, this is still a matter of debate.<sup>5</sup> Interestingly,  $\beta$ -tubulin isotypes exhibit significantly different binding affinities toward colchicine, with  $\beta$ IV-tubulin showing the highest binding affinity followed by  $\beta$ II- and  $\beta$ III-tubulin.<sup>6</sup> In addition, the tubulin-colchicine complex exhibits a slow dissociation reaction and tubulin-isotype-specific binding kinetics.<sup>6–8</sup> A detailed understanding of the differential structural and kinetic properties of colchicine-site binders to different  $\beta$ -tubulin isotypes will, therefore, likely be of value as a first step in selecting cancer types or individual patients for testing. In addition, the crystallographic and molecular dynamics comparison of the binding of different colchicine-site drugs may allow for the determination of binding properties associated with molecules reported to exhibit preferred efficacy and safety profiles in patients to date.

Plinabulin (BPI-2358) is a synthetic analog of the natural product phenylahistin isolated from *Aspergillus* species and is classified as a colchicine-site microtubule-destabilizing agent.<sup>9–12</sup> Several studies have been conducted to shed light on the structure-activity relationships of plinabulin and its derivative.<sup>13–15</sup> The parent plinabulin compound is active against various multi-drug resistant cancer cell lines *in vitro*,<sup>10</sup> and its administration resulted in favorable outcomes in a phase 1 clinical study in patients with advanced malignancies.<sup>16</sup> Moreover, in a phase 2 clinical trial in non-small cell lung cancer (NSCLC) patients with measurable disease, adding plinabulin to docetaxel increased patient overall survival and protected against the development of docetaxel-induced neutropenia. Knowledge of the binding properties of plinabulin to different tubulin isotypes may be useful in developing a strategy to target cancers outside NSCLC. The adverse-effect profile of plinabulin in patients is predominately gastrointestinal and, apart from transient hypertension (on the order of hours), lacks the focus on cardiovascular toxicities (hypertension, tachycardia, bradycardia, QTc prolongation, myocardial infarction, and myocardial ischemia), seen with other colchicine-site-binding agents.<sup>17</sup> Moreover, while plinabulin is utilized to treat chemotherapy-induced neutropenia, other colchicine-site agents such as colchicine and combretastatin-A4 are reported to increase or cause neutropenia.<sup>18,19</sup> Since the adverse-effect profile of plinabulin differs from that of other agents binding to the same pocket of tubulin, detailed colchicine-site structural binding and kinetic comparison among agents may both aid to understand the mechanism of action of plinabulin and inform future molecular drug discovery efforts. Currently, plinabulin is undergoing phase 3 clinical trials for both the treatment of cancer and for the amelioration of chemotherapy-induced neutropenia (CIN).<sup>20,21</sup>

Here, we first solved the crystal structures of plinabulin bound to  $\beta$ II- and  $\beta$ III-tubulin to 1.5 and 1.8 Å resolution, respectively. We found that residue substitutions in the colchicine site between  $\beta$ II- and  $\beta$ III-tubulin differentially engage the drug molecule. Using our high-resolution crystal structures, we performed molecular dynamics (MD) and enhanced sampling simulations aimed at gathering detailed information about the thermodynamics and kinetics of plinabulin binding to  $\beta$ II- and  $\beta$ III-tubulin. Our thermodynamic and kinetic simulation studies suggest a higher affinity of plinabulin toward  $\beta$ II- relative to  $\beta$ III-tubulin. Importantly, biochemical assays aimed at evaluating the binding selectivity of plinabulin toward the two isotypes confirmed that the compound is more prone to bind to the  $\beta$ II- relative to the  $\beta$ III-tubulin. We also compared the residence time (i.e., the inverse of  $k_{off}$ ) of plinabulin within the colchicine site of  $\beta$ II-tubulin with that of colchicine and combretastatin-A4, two drug candidates binding tubulin at the colchicine site.<sup>22,23</sup> Our results suggest that plinabulin shows intermediate unbinding kinetics between the very slow

<sup>1</sup>Computational & Chemical Biology, Istituto Italiano di Tecnologia, via Morego, 30, 16163 Genova, Italy

<sup>2</sup>BiKi Technologies s.r.l., via XX Settembre 33, 16161 Genova, Italy

<sup>3</sup>Laboratory of Biomolecular Research, Department of Biology and Chemistry, Paul Scherrer Institut, 5232 Villigen PSI, Switzerland

<sup>4</sup>Centro de Investigaciones Biológicas, CSIC, 28006 Madrid, Spain

<sup>5</sup>BeyondSpring Pharmaceuticals Inc., 28 Liberty Street, New York, NY 10005, USA

<sup>6</sup>University of Basel, Biozentrum, 4056 Basel, Switzerland

<sup>7</sup>Department of Pharmacy and Biotechnology, Alma Mater Studiorum, University of Bologna, via Belmeloro 6, 40126 Bologna, Italy

<sup>8</sup>Present address: Medicinal Chemistry, Early Cardiovascular, Renal and Metabolism, R&D BioPharmaceuticals, AstraZeneca, 431 83 Mölndal, Sweden

<sup>9</sup>These authors contributed equally

<sup>10</sup>Lead Contact

\*Correspondence: [michel.steinmetz@psi.ch](mailto:michel.steinmetz@psi.ch) (M.O.S.), [andrea.cavalli@iit.it](mailto:andrea.cavalli@iit.it) (A.C.)

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colchicine off-rate and the very fast unbinding of combretastatin-A4. Together, our study establishes a combined experimental and computational framework to investigate selectivity mechanisms of MTAs against  $\beta$ -tubulin isotypes and residence time of their binding into different tubulin pockets. It further paves the way to design more selective and efficacious anti-tubulin drug candidates for treating cancer and possibly contributes to the explanation of the different pharmacological profiles observed for MTAs.

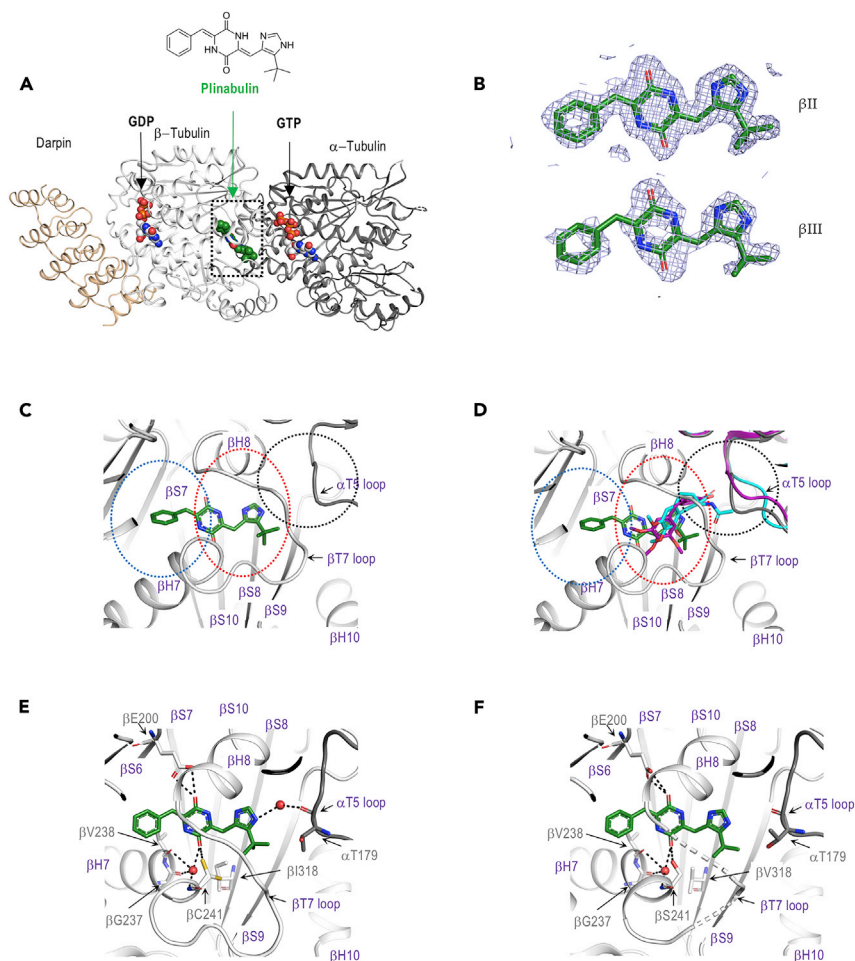
## RESULTS

### Crystal Structure of Plinabulin Bound to $\beta$ II- and $\beta$ III-tubulin

The crystal structure of plinabulin bound to bovine brain tubulin (predominantly composed of  $\alpha$ I- and  $\beta$ II-tubulin<sup>24</sup>) complexed to darpin D1 (the complex is denoted  $T_{\beta$ II D1-plinabulin) was determined at 1.5 Å resolution (Table S1). In agreement with a previous 2.7 Å resolution crystal structure of plinabulin in complex with a macromolecular assembly composed of two tubulin dimers, tubulin tyrosine ligase and the stathmin-like domain of RB3 ( $T_2$ R-TTL-plinabulin<sup>12</sup>), the drug binds to the colchicine site of tubulin (Figures 1A and 1B). The colchicine site is formed by helices  $\beta$ H7 and  $\beta$ H8, the  $\beta$ T7 loop, and the  $\beta$ S8 and  $\beta$ S9 strands of  $\beta$ -tubulin and is completed by the  $\alpha$ T5 loop of  $\alpha$ -tubulin.<sup>25</sup> It can be subdivided into a central pocket (zone 2) and two flanking accessory pockets, one that faces the  $\alpha$ -tubulin subunit (zone 1) and the other that is buried deeper in the  $\beta$ -tubulin subunit (zone 3).<sup>26</sup> As shown in Figure 1C, the benzyl and the diketopiperazine-imidazole moieties of plinabulin occupy zones 3 and 2, respectively, which are located mostly on  $\beta$ -tubulin. In contrast, the two archetypical colchicine-site drugs colchicine and combretastatin-A4 occupy zones 1 and 2 in a similar manner and overlap to only a small extent with plinabulin (Figure 1D). Notably, the  $\alpha$ T5 loop in the tubulin-plinabulin structure is in a “close” conformation, while the ones seen in the tubulin-colchicine and tubulin-combretastatin-A4 structures adopt a more “open” conformation to accommodate the respective ligands in zone 1 of the colchicine site (Figure 1D).

Several hydrophobic residues of  $\beta$ -tubulin establish van der Waals contacts with plinabulin, including  $\beta$ V238 and  $\beta$ I318 (Figure 1E). Additional hydrogen bonding interactions with plinabulin are established by residues  $\beta$ E200 and  $\beta$ V238 and with residues  $\beta$ G237,  $\beta$ C241, and  $\alpha$ T179 via two water molecules (Figure 1E). Notably, the side chain of  $\beta$ C241 is present in two alternate conformations, one of which is forming a hydrogen bond with the carbonyl group of the diketopiperazine moiety of plinabulin (Figure 1E). Interestingly, the  $\beta$ C241 residue is replaced by a serine in the human  $\beta$ -tubulin isotypes  $\beta$ I,  $\beta$ III, and  $\beta$ VI (Figure S1). We reasoned that the presence of an alternate conformation of the  $\beta$ C241 side chain could be due to a weak interaction of its sulfhydryl group with plinabulin and that the presence of the more polar hydroxyl group of  $\beta$ S241 in  $\beta$ I-,  $\beta$ III-, or  $\beta$ VI-tubulin isotypes might result in a higher binding affinity toward plinabulin.

To test this hypothesis, we determined the crystal structure of plinabulin in complex with recombinant human  $\alpha$  $\beta$ III-tubulin<sup>27</sup> bound to darpin D1 (denoted  $T_{\beta$ III D1-plinabulin) at 1.8 Å resolution (Table S1). The overall structure of the  $T_{\beta$ III D1-plinabulin complex could be readily superimposed with both the  $T_{\beta$ II D1-plinabulin complex structure (root-mean-square deviation [RMSD] of 0.258 Å over 896 C $\alpha$  atoms) and that obtained in the absence of any ligand (PDB ID 4DRX, RMSD of 0.306 Å over 869 C $\alpha$  atoms). This result suggests that the global conformation of both  $\beta$ -tubulin isotypes is very similar and that plinabulin does not significantly affect their tertiary structures. In agreement with our hypothesis, residue  $\beta$ S241 of the  $T_{\beta$ III D1-plinabulin



**Figure 1. Plinabulin Binds to the Colchicine Site of Tubulin**

(A) Overall view of the  $T_{\beta\text{III}}\text{D1}$ -plinabulin crystal structure. Plinabulin is displayed as green spheres. The  $\alpha$ - and  $\beta$ -tubulin subunits are represented in dark and light gray, respectively. The guanosine nucleotide molecules are shown as spheres and are color-coded according to atom types: carbon, white; oxygen, red; and nitrogen, blue. The dashed black box highlights the region shown in panels (C)–(F).

(B) Fit of plinabulin in the electron density of the  $T_{\beta\text{III}}\text{D1}$ -plinabulin and  $T_{\beta\text{II}}\text{D1}$ -plinabulin crystal structures. The electron density (blue mesh) is displayed using a sigma-A-weighted 2Fo-Fc map contoured at 1.0 level.

(C) Plinabulin-binding site showing the major secondary structure elements shaping the colchicine site of  $\alpha\beta$ -tubulin. Three zones in the colchicine site are highlighted by black (zone 1), red (zone 2), and blue circles (zone 3).

(D) Overlays comparing the binding pose of plinabulin to the ones of colchicine (cyan sticks) and combretastatin-A4 (purple sticks).

(E and F) Zoomed-in view of the plinabulin-binding site in the  $T_{\beta\text{II}}\text{D1}$ -plinabulin (E) and  $T_{\beta\text{III}}\text{D1}$ -plinabulin (F) complex structures. Plinabulin is shown in green sticks representation. Important interacting residues (light gray sticks) are labeled and color-coded according to their atom composition. Water molecules are displayed as red spheres.

structure displayed a single side-chain conformation, and its hydroxyl group was located at an ideal hydrogen-bond distance of 2.8 Å from the carbonyl group of the diketopiperazine ring of plinabulin; in comparison, the sulfhydryl group of  $\beta\text{C241}$  in  $T_{\beta\text{II}}\text{D1}$  is located at a 3.3 Å distance (Figures 1E, 1F, and S5). This observation suggests that plinabulin binds tighter to  $\beta\text{III}$ - than  $\beta\text{II}$ -tubulin; however, despite the fact that both complex structures were prepared, processed, and solved exactly

in the same manner, we noted that the binding site was only partially occupied with plinabulin in the  $T_{\beta_{III}}D1$ -plinabulin complex. This was substantiated by a less well defined electron density for the ligand (Figure 1B) as well as by the presence of only partial electron density for the  $\beta T7$  loop that also assumes its alternate conformation observed in the apo form of the colchicine site (data not shown). Along the same line and again in contrast to what we observed in the  $T_{\beta_{III}}D1$ -plinabulin structure, the water-mediated hydrogen bond between plinabulin and the main chain of  $\alpha T179$  as well as a part of the  $\beta T7$  loop are absent and poorly resolved, respectively, in the  $T_{\beta_{III}}D1$ -plinabulin structure (Figure 1F).

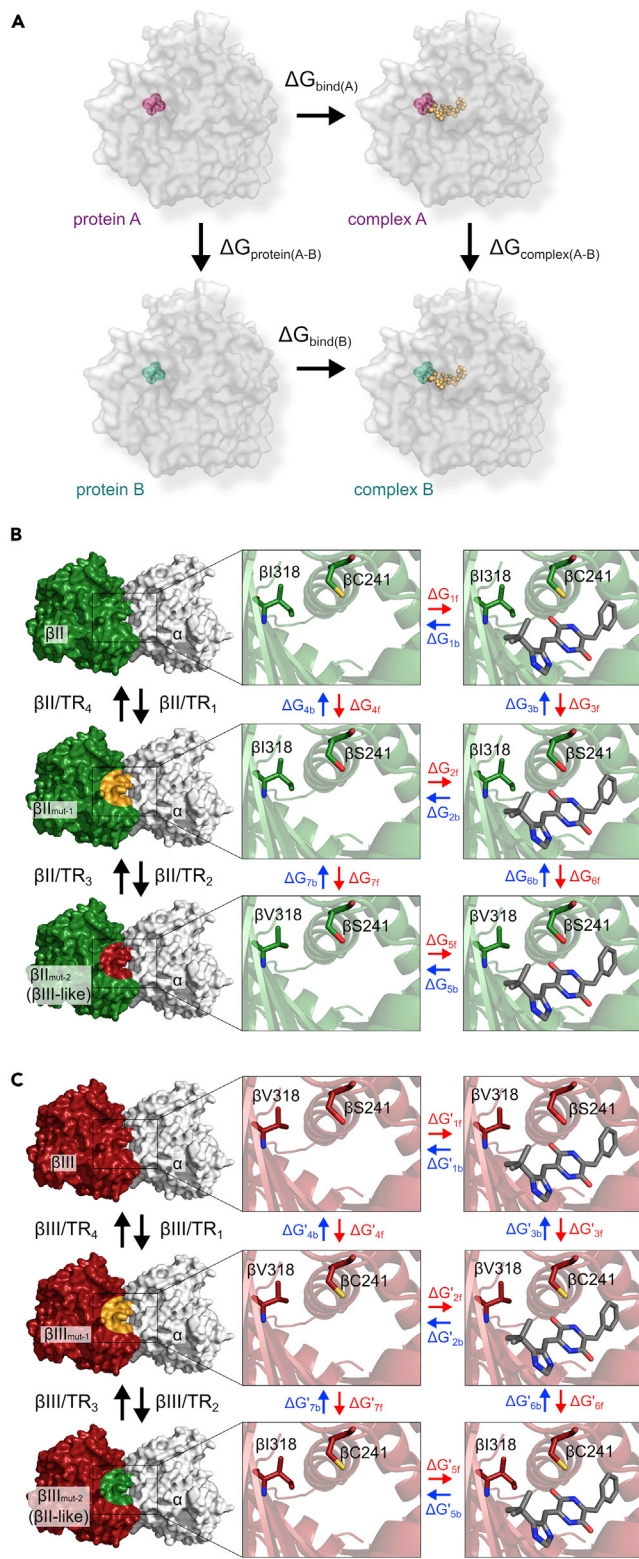
The  $\beta_{II}$ - and  $\beta_{III}$ -tubulin isotypes share an overall sequence identity of 91% (Figure S1). At the colchicine site, only the two plinabulin-interacting residues  $\beta C241$  and  $\beta I318$  of  $\beta_{II}$ -tubulin are replaced by a serine and a valine, respectively, in  $\beta_{III}$ -tubulin. These slight but nevertheless notable amino acid differences prompted us to perform computational studies to investigate the thermodynamic and kinetic profiles of plinabulin binding to the two tubulin isotypes. In particular, we performed MD and enhanced sampling simulations (i.e., thermodynamic integration [TI] and scaled MD) using both the structures of plinabulin bound to  $\beta_{II}$ - and  $\beta_{III}$ -tubulin as starting points.

### Free Energy of Plinabulin Binding to $\beta_{II}$ - and $\beta_{III}$ -Tubulin

Initially, we employed the molecular mechanics Generalized Born surface area (MM/GBSA) approach,<sup>28,29</sup> a fast and efficient method that is widely utilized for estimating binding affinities ( $\Delta G_{\text{bind}}$ ) using MD-derived conformational ensembles. To this end, we performed  $\sim 100$  ns of classical MD simulations for both the  $\beta_{II}$ -tubulin-plinabulin and  $\beta_{III}$ -tubulin-plinabulin systems, and then we computed the  $\Delta G_{\text{bind}}$  via the MM/GBSA formalism (see Experimental Procedures for details). The estimated  $\Delta G_{\text{bind}}$  was very similar between the two tubulin isotypes, being  $-36.28 \pm 2.95$  kcal/mol for  $\beta_{II}$ -tubulin-plinabulin and  $-36.06 \pm 3.47$  kcal/mol for  $\beta_{III}$ -tubulin-plinabulin. However, since the entropic contribution is neglected in these calculations, these values mainly account for the enthalpic components of the binding free energies.

To better describe the binding process and get a more accurate estimation of the binding energy, we carried out more rigorous physics-based free energy calculations via TI. For this, we computed the binding free energy difference ( $\Delta\Delta G_{\text{bind}}$ ) between the  $\beta_{II}$ -tubulin-plinabulin and  $\beta_{III}$ -tubulin-plinabulin systems (forward and backward to ensure convergence) by performing multi-step alchemical transformations, which gradually mutated the colchicine site from  $\beta_{II}$ - to  $\beta_{III}$ -tubulin and vice versa. Then, using the TI formalism (Figure 2), we calculated the free energy loss or gain over these transformations. We first computed the  $\Delta\Delta G_{\text{bind}}$  associated to the  $\beta_{II} \rightarrow \beta_{III}$  transformation, mutating  $\beta C241$  to serine and subsequently  $\beta I318$  to valine (Figure 2B). We found that the  $\beta C241 \rightarrow \beta S241$  transformation (denoted  $\beta_{II}/TR_1$ ; Table 1) has an energetic cost of  $\Delta\Delta G_{\text{bind}[\beta_{II}/TR_1]} = 0.88$  kcal/mol, being in favor of  $\beta_{II}$ -tubulin. Similarly, also the  $\beta I318 \rightarrow \beta V318$  transformation (denoted  $\beta_{II}/TR_2$ ; Table 1) is slightly in favor of  $\beta_{II}$ -tubulin showing a  $\Delta\Delta G_{\text{bind}[\beta_{II}/TR_2]} = 0.29$  kcal/mol. Together, the two transformations showed an overall  $\Delta\Delta G_{\text{bind}[\beta_{II} \rightarrow \beta_{III}\text{-like}]} = 1.07$  kcal/mol, with a more favorable binding free energy for plinabulin in complex with  $\beta_{II}$ -tubulin relative to  $\beta_{III}$ -tubulin.

To check the convergence of both transformations ( $\beta_{II}/TR_1$  and  $\beta_{II}/TR_2$ ; Table 1), we also performed the backward TI starting from the mutated  $\beta_{II}$ -tubulin ( $\beta C241S$  and  $\beta I318V$ ) and alchemically transforming it back into the wild-type  $\beta_{II}$ -tubulin (Figure 2B). To this end, we mutated  $\beta V318$  to isoleucine (denoted  $\beta_{II}/TR_3$ ; Table 1), obtaining a  $\Delta\Delta G_{\text{bind}[\beta_{II}/TR_3]}$  of  $-0.46$  kcal/mol. Then, we used the same



**Figure 2. Scheme of the Thermodynamic Cycle**

(A) General scheme of the thermodynamic cycle used to calculate the relative binding free energy difference between the ligand in complex with protein A (upper-right) and the ligand in complex

**Figure 2. Continued**

with protein B (lower-right). In this example, protein A and B can either be the wild type or the mutated tubulin form since both the forward and the backward transformations have been performed. The horizontal legs correspond to the binding process in system A (upper,  $\Delta G_{\text{bind}(A)}$ ) and in system B (lower,  $\Delta G_{\text{bind}(B)}$ ). The vertical legs correspond to the alchemical transformations of protein A into protein B in the apo form (left,  $\Delta G_{\text{protein}(A-B)}$ ) and in complex with the ligand (right,  $\Delta G_{\text{complex}(A-B)}$ ). The TI is used to estimate the free energy associated with the vertical legs of the cycle. The relative binding free energy difference ( $\Delta\Delta G_{\text{bind}}$ ) is the difference between  $\Delta G_{\text{complex}(A-B)}$  and  $\Delta G_{\text{protein}(A-B)}$ .

(B) Representation of the alchemical transformations performed in this work. Starting from the  $\beta$ II-tubulin system, we first mutated  $\beta$ C241 to serine ( $\beta$ II/TR<sub>1</sub>) to obtain the  $\beta$ II<sub>mut-1</sub> system and then  $\beta$ I318 to valine ( $\beta$ II/TR<sub>2</sub>) to obtain a new  $\beta$ II-tubulin system having a  $\beta$ III-like colchicine site ( $\beta$ II<sub>mut-2</sub>). The binding free energy associated to the  $\beta$ II/TR<sub>1</sub> and  $\beta$ II/TR<sub>2</sub> transformations are given by the formulas  $\Delta\Delta G_{\text{bind}[\beta\text{II} \rightarrow \beta\text{II mut-1}]} = \Delta G'_{3f} - \Delta G'_{4f}$  and  $\Delta\Delta G_{\text{bind}[\beta\text{II mut-1} \rightarrow \beta\text{II mut-2}]} = \Delta G'_{6f} - \Delta G'_{7f}$ , respectively (where “f” stands for “forward”). Therefore, the total binding free energy to transform the wild-type  $\beta$ II to  $\beta$ II having a  $\beta$ III-like colchicine site (i.e.,  $\Delta\Delta G_{\text{bind}[\beta\text{II} \rightarrow \beta\text{III-like}]}$ ) is the sum of  $\Delta\Delta G_{\text{bind}[\beta\text{II} \rightarrow \beta\text{II mut-1}]}$  and  $\Delta\Delta G_{\text{bind}[\beta\text{II mut-1} \rightarrow \beta\text{II mut-2}]}$ . Starting from the  $\beta$ III-tubulin like system, we also performed the backward transformations ( $\beta$ II/TR<sub>3</sub> and  $\beta$ II/TR<sub>4</sub>) to obtain again the wild-type  $\beta$ II-tubulin system.

(C) Starting from the  $\beta$ III-tubulin system, we first mutated  $\beta$ S241 into cysteine ( $\beta$ III/TR<sub>1</sub>) to obtain  $\beta$ III<sub>mut-1</sub> and then  $\beta$ V318 to isoleucine ( $\beta$ III/TR<sub>2</sub>) to obtain a new  $\beta$ III-tubulin system having a  $\beta$ II-tubulin-like colchicine site ( $\beta$ III<sub>mut-2</sub>). The binding free energy associated to the  $\beta$ III/TR<sub>1</sub> and  $\beta$ III/TR<sub>2</sub> transformations are given by the formulas  $\Delta\Delta G_{\text{bind}[\beta\text{III} \rightarrow \beta\text{III mut-1}]} = \Delta G'_{3f} - \Delta G'_{4f}$  and  $\Delta\Delta G_{\text{bind}[\beta\text{III mut-1} \rightarrow \beta\text{III mut-2}]} = \Delta G'_{6f} - \Delta G'_{7f}$ , respectively. The total binding free energy to transform the wild-type  $\beta$ III-tubulin to  $\beta$ III-tubulin mut-2 (i.e.,  $\Delta\Delta G_{\text{bind}[\beta\text{III} \rightarrow \beta\text{III mut-2}]}$ ) is the sum of  $\Delta\Delta G_{\text{bind}[\beta\text{III} \rightarrow \beta\text{III mut-1}]}$  and  $\Delta\Delta G_{\text{bind}[\beta\text{III mut-1} \rightarrow \beta\text{III mut-2}]}$ . Also, here we performed the backward transformation ( $\beta$ III/TR<sub>3</sub> and  $\beta$ III/TR<sub>4</sub>) to obtain again the wild-type  $\beta$ III-tubulin system.

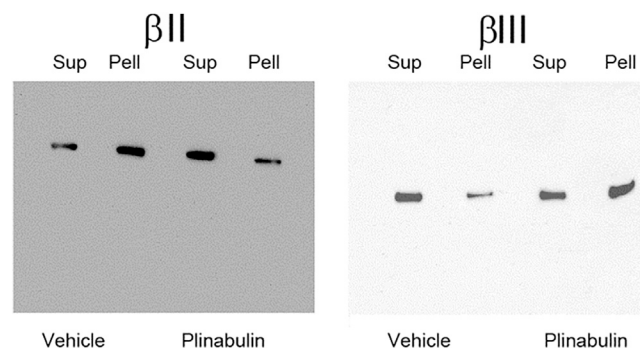
approach to transform  $\beta$ S241 into cysteine (denoted  $\beta$ II/TR<sub>4</sub>; Table 1), obtaining a  $\Delta\Delta G_{\text{bind}[\beta\text{II/TR}_4]}$  of  $-1.27$  kcal/mol. The two transformations showed an overall  $\Delta\Delta G_{\text{bind}[\beta\text{III-like} \rightarrow \beta\text{II}]}$  of  $-1.73$  kcal/mol, which is in very good agreement with the forward transformation ( $1.07$  kcal/mol), suggesting that plinabulin binding is thermodynamically favored in the  $\beta$ II-tubulin isotype.

In light of the small free energy difference, we improved the reliability of our results by performing TI with the structure of plinabulin bound to  $\beta$ III-tubulin as a starting point and transforming the two key residues of the colchicine site into those of the  $\beta$ II-tubulin isotype ( $\beta$ S241C and  $\beta$ V318I, Figure 2C). As a result, we found that both the  $\beta$ S241  $\rightarrow$   $\beta$ C241 and  $\beta$ V318  $\rightarrow$   $\beta$ I318 (denoted as  $\beta$ III/TR<sub>1</sub> and  $\beta$ III/TR<sub>2</sub>, respectively; Table 1) are favored, showing a  $\Delta\Delta G_{\text{bind}}$  of  $-1.63$  and  $-0.58$  kcal/mol, respectively (the overall  $\Delta\Delta G_{\text{bind}[\beta\text{III} \rightarrow \beta\text{II-like}]}$  is  $-2.21$  kcal/mol). Here too, we carried out the backward transformation to assess the convergence of our simulations. We started from the mutated  $\beta$ III-tubulin system ( $\beta$ C241S and  $\beta$ I318V) and transformed it into wild-type  $\beta$ III-tubulin (Figure 2C). Similarly to the protocol reported above, we first mutated  $\beta$ I318 to valine (denoted as  $\beta$ III/TR<sub>3</sub>; Table 1) and then  $\beta$ C241 to serine (denoted  $\beta$ III/TR<sub>4</sub>; Table 1) and obtained a  $\Delta\Delta G_{\text{bind}}$  of  $1.06$  and  $1.45$  kcal/mol, respectively (the overall  $\Delta\Delta G_{\text{bind}[\beta\text{III-like} \rightarrow \beta\text{II}]}$  is  $2.51$  kcal/mol). These results show that the forward and backward alchemical transformations have strikingly similar absolute values ( $2.21$  versus  $2.51$  kcal/mol). These calculations further showcase that plinabulin binding is thermodynamically favored for the  $\beta$ II-tubulin isotype relative to  $\beta$ III-tubulin.

**Plinabulin Selectivity Investigated through Biochemical Assays**

To obtain evidence for the predicted differential interaction of plinabulin with  $\beta$ II- and  $\beta$ III-tubulin, we assessed the biochemical activity of the drug on bovine brain tubulin that is composed of 58%  $\beta$ II, 25%  $\beta$ III and 17% other tubulin isotypes.<sup>30</sup> To this end, we analyzed the composition of  $\beta$ II- and  $\beta$ III-tubulin present in unassembled





**Figure 3. Plinabulin Selectivity Investigated through Biochemical Assays**

Differential effect of plinabulin in the assembly of  $\beta$ II- and  $\beta$ III-tubulin isotypes of calf brain tubulin (60  $\mu$ M). Representative western blots (the experiment was repeated thrice) of the tubulin isotype contents of supernatants and pellets of 60  $\mu$ M tubulin assembled in the absence and presence of 5  $\mu$ M plinabulin. Sup, supernatant; Pell, pellet.

and assembled bovine brain tubulin (60  $\mu$ M), which was incubated in the absence and presence of 5  $\mu$ M plinabulin using a standard microtubule pelleting assay<sup>31</sup> in combination with western blotting against both isotypes. The idea behind this experiment is that the tubulin isotype that interacts better with the drug will be prevented to a greater extent from assembly into microtubules compared to the absence of any drug.

Consistent with previous findings<sup>32</sup> in absence of plinabulin,  $\beta$ II-tubulin is more prone to assemble into microtubules as compared to  $\beta$ III-tubulin, as is shown by the ratios between tubulin isotypes in the supernatant and in the pellet in the presence and absence of tubulin, respectively (Figure 3). These results indicate that in a competitive environment in which both  $\beta$ II- and  $\beta$ III-tubulin isoforms are available for incorporation into microtubules, plinabulin will increase the relative probability for  $\beta$ III-tubulin incorporation over  $\beta$ II-tubulin, supporting our structural and computational results that plinabulin preferentially interacts with  $\beta$ II- compared to  $\beta$ III-tubulin.

### Residence Time of Plinabulin and Comparison to Colchicine and Combretastatin-A4

We next focused on the unbinding kinetics by investigating the residence time of plinabulin in the two tubulin isotypes. We utilized scaled MD (SMD) simulations, an enhanced sampling method that enables sampling of rare events, including ligand unbinding, as recently reported for different pharmaceutically relevant case studies.<sup>33–37</sup> We ran multiple replicas (20 for each system) of SMD simulations of both  $\beta$ II- and  $\beta$ III-tubulin-plinabulin systems. Unlike the free energy calculations reported above, we here modeled the two glutamate-rich and disordered C-terminal tails of both  $\alpha$ - and  $\beta$ -tubulin to take into account the possible role these highly negatively charged flexible moieties could play upon ligand unbinding (see the [Supplemental Information](#)). We found that the mean scaled residence time of plinabulin in the  $\beta$ II-tubulin isotype was  $71.0 \pm 10.0$  ns, whereas in the  $\beta$ III-tubulin, it was  $52.7 \pm 8.2$  ns. Therefore, the release of bound plinabulin is slightly slower from the  $\beta$ II- than from  $\beta$ III-tubulin system, in agreement with the thermodynamics calculations reported above.

We next analyzed the exit paths of the ligand from the colchicine site. This analysis was performed by monitoring the center of mass (COM) of plinabulin along the unbinding trajectories. We found three possible exit routes, denoted as path A, B,

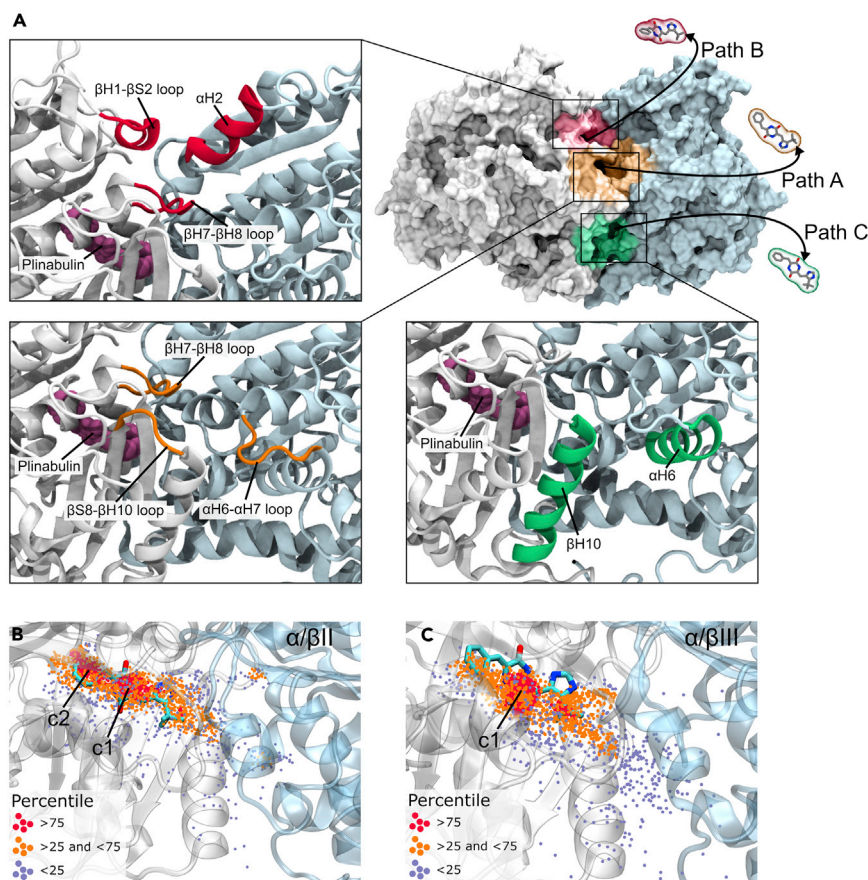
**Table 1. List of Transformations Performed for TI Studies, along with the  $\Delta G$  Values of Each Transformation**

Transformation	Simulation's Name	Starting System	Final System		$\Delta G$ (kcal/Mol)
$\beta$ II to $\beta$ III	$\beta$ II/TR <sub>1</sub>	$\beta$ C241 $\beta$ I318	$\beta$ S241 $\beta$ I318	<i>forward</i>	0.88
	$\beta$ II/TR <sub>2</sub>	$\beta$ S241 $\beta$ I318	$\beta$ S241 $\beta$ V318		0.29
	$\beta$ II/TR <sub>3</sub>	$\beta$ S241 $\beta$ V318	$\beta$ S241 $\beta$ I318	<i>backward</i>	-0.46
	$\beta$ II/TR <sub>4</sub>	$\beta$ S241 $\beta$ I318	$\beta$ C241 $\beta$ I318		-1.27
$\beta$ III to $\beta$ II	$\beta$ III/TR <sub>1</sub>	$\beta$ S241 $\beta$ V318	$\beta$ C241 $\beta$ V318	<i>forward</i>	-1.63
	$\beta$ III/TR <sub>2</sub>	$\beta$ C241 $\beta$ V318	$\beta$ C241 $\beta$ I318		-0.58
	$\beta$ III/TR <sub>3</sub>	$\beta$ C241 $\beta$ I318	$\beta$ C241 $\beta$ V318	<i>backward</i>	1.06
	$\beta$ III/TR <sub>4</sub>	$\beta$ C241 $\beta$ V318	$\beta$ S241 $\beta$ V318		1.45

and C in [Figures 4A](#) and [S6](#). In the vast majority of the trajectories, plinabulin unbound tubulin through path A that involves leaving the colchicine site through a small channel located between the  $\alpha$ - and  $\beta$ -tubulin subunits and delimited by the three loops  $\beta$ H7- $\beta$ H8,  $\beta$ S8- $\beta$ H10, and  $\alpha$ H6- $\alpha$ H7 (colored in orange in [Figures 4A](#) and [S6](#)). Notably, we also found that in path A, the ligand could stop over in a transient pocket at the  $\alpha\beta$ -tubulin intradimer interface before leaving the protein. Interestingly, this observation is in line with experimental data reported by Yamazaki et al.,<sup>38</sup> who have suggested that plinabulin could indeed also bind to this region of tubulin. In one simulation for the  $\beta$ II- and in two for the  $\beta$ III-tubulin systems, ligand unbinding occurred through path B. In this path, the ligand went across a small channel at the  $\alpha\beta$ -tubulin intradimer interface, in the proximity of loop  $\beta$ H1- $\beta$ S2 and helix  $\alpha$ H2 (colored in red in [Figures 4A](#) and [S6](#)). Finally, in four SMD simulations of both systems, plinabulin unbound tubulin through path C. Here too, the ligand went across the  $\alpha\beta$ -tubulin intradimer interface in the proximity of helices  $\beta$ H10 and  $\alpha$ H6 (colored in green in [Figures 4A](#) and [S6](#)).

Interestingly, SMD trajectories also showed that plinabulin could adopt two possible poses within the colchicine site of  $\beta$ II-tubulin. In particular, above the 75<sup>th</sup> percentile among the collected data, plinabulin was found in two main clusters, referred to as *c1* and *c2* (see red dots in [Figures 4B](#) and [S2](#)). The *c1* cluster corresponds to the crystallographic binding pose, while the *c2* cluster corresponds to a slightly shifted pose where the phenyl ring of plinabulin finds space in an adjacent deep pocket in the colchicine site (see [Figures 4B](#) and [S2](#)). Notably, the crystal structure of  $\beta$ II-tubulin in complex with a plinabulin derivative containing an acetophenone group revealed that this moiety indeed exploits this additional pocket.<sup>39</sup> Conversely, the same analysis performed on the MD trajectories collected with the  $\beta$ III-tubulin system revealed that the most probable binding pose of plinabulin (i.e., above 75<sup>th</sup> percentile) is the crystallographic one, which is recapitulated by cluster *c1*. These results show that the relative population of poses of plinabulin may vary between the two tubulin isotypes most likely as a consequence of a different plasticity of their respective colchicine sites.

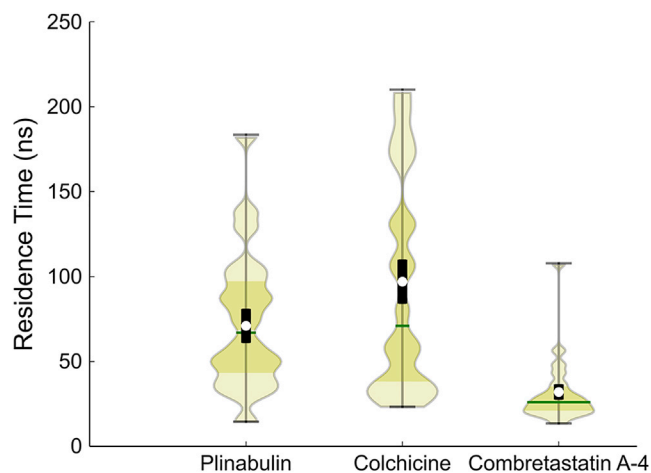
To compare the unbinding kinetics of plinabulin with other colchicine-site ligands, we studied colchicine and combretastatin-A4. To this end, we employed the same



**Figure 4. Unbinding Paths of Plinabulin**

(A) Unbinding paths observed during our SMD simulations of both  $\beta$ II-tubulin-tail-plinabulin and  $\beta$ III-tubulin-tail-plinabulin systems. The three “exit channels” are highlighted in orange, red, and green for paths A, B, and C, respectively. The white surface represents the  $\beta$  subunit, whereas the cyan surface indicates the  $\alpha$  subunit. The “H” stands for helix, whereas the “S” stands for  $\beta$ -strand. (B and C) Representation of the probability to find the COM (center of mass) of plinabulin within the colchicine site of  $\beta$ II-tubulin (B) and  $\beta$ III-tubulin (C) computed along our SMD trajectories. Each point represents the spatial localization of the plinabulin’s COM according to the following color scheme: red has a probability of  $>75^{\text{th}}$  percentile, orange has probability within  $25^{\text{th}}$  and  $75^{\text{th}}$  percentile, and indigo has a probability of  $<25^{\text{th}}$  percentile.

simulation protocol as described above, running multiple replicas of SMD simulations with the  $\beta$ II-tubulin system in complex with the two compounds, and using the corresponding high-resolution crystal structure as starting points.<sup>40,41</sup> After equilibration, 20 SMD simulations for each system were carried out using a scaling factor of 0.4 and restraining the GTP, the GDP, the  $\text{Mg}^{2+}$ , and the protein’s backbone, with weak positional restraints (harmonic force constant =  $50 \text{ kJ mol}^{-1} \text{ nm}^{-2}$ ) to prevent unfolding. We excluded from this positional restraint all the residues  $6 \text{ \AA}$  from the inhibitors along with the residues forming the exit channels as identified by the Pocketron analysis<sup>42</sup> (see the [Supplemental Information](#) for further details). To compute the residence time of each ligand, we averaged the scaled unbinding time of the 20 SMD simulations and performed a bootstrap analysis. Colchicine showed the highest residence time ( $97.1 \pm 12.9 \text{ ns}$ ), followed by plinabulin ( $71.0 \pm 10.0 \text{ ns}$ , see above), and finally combretastatin-A4 ( $32.0 \pm 4.5 \text{ ns}$ ), which unbound remarkably faster relative to the two other compounds (Figure 5). These results confirm that the promising molecular properties of plinabulin also from the



**Figure 5. Violin Plots Showing the Distribution of the Residence Time Calculated along the 20 SMD Replicates of the  $\beta$ II-Tubulin-Tail-Plinabulin,  $\beta$ II-Tubulin-Tail-Colchicine, and  $\beta$ II-Tubulin-Tail-Combretastatin-A-4 Systems Using a Kernel Density Estimate**

The median (dark green line), the interquartile ranges (dark olive fill), and the 2% and 98% percentiles (black whiskers) are shown. The mean and the standard error computed via bootstrap analysis (white dots and black box, respectively) are also shown. The mean and the standard error computed via bootstrap analysis (white dot and black box, respectively) are also shown. The mean and the standard error of the residence time for plinabulin, colchicine, and combretastatin-A4 are 71.0  $\pm$  10.0 ns, 97.1  $\pm$  12.9 ns, and 32.0  $\pm$  4.5 ns, respectively. See also the [Supplemental Information](#).

kinetics standpoint, showing an average residence time between a remarkably slow colchicine-site binder (colchicine<sup>43</sup>) and a rather fast binder (combretastatin-A4<sup>44</sup>). The three ligands utilized the same paths A, B, and C to leave the colchicine site, with a different propensity for one unbinding route over others. Much longer, brute-force MD simulations would provide a more detailed picture of the unbinding mechanisms of plinabulin, colchicine, and combretastatin-A4; however, such simulations are out of the reach of current computational capabilities.

## DISCUSSION

The colchicine site is a pocket predominantly located on the  $\beta$ -tubulin subunits of the  $\alpha\beta$ -tubulin heterodimer, which is targeted by microtubule-destabilizing agents including plinabulin, colchicine, and combretastatin-A4.<sup>16</sup> Human cells express different tubulin isoforms,<sup>45</sup> which results in discrete single amino acid substitutions in the colchicine site. These substitutions likely affect the different selectivity and pharmacological profiles of colchicine-site drugs toward different tubulin isoforms. Indeed, as previously mentioned, the archetypical colchicine-site ligand colchicine displays different binding kinetics and binding affinities toward different  $\beta$ -tubulin isoforms.<sup>6–8</sup> However, a detailed understanding of the differential structural and kinetic properties of colchicine-site binders to different  $\beta$ -tubulin isoforms is largely lacking.

Here, we used X-ray crystallography and MD simulations to study the binding profile of plinabulin toward two different  $\beta$ -tubulin isoforms,  $\beta$ II- and  $\beta$ III-tubulin. First, we solved the crystal structures of plinabulin bound to both  $\beta$ II- and  $\beta$ III-tubulin at high resolution. The structures revealed that plinabulin occupies the colchicine site of both tubulin isoforms, displaying a similar binding mode, as the two sites differ by only two residues ( $\beta$ C241 versus  $\beta$ S241 and  $\beta$ I318 versus  $\beta$ V318 in  $\beta$ II-versus  $\beta$ III-tubulin, respectively). In particular, we noted that the sulfhydryl group of the side

chain of  $\beta$ C241 of  $\beta$ II-tubulin is located at a greater distance from the carbonyl group of the diketopiperazine ring of plinabulin relative to the hydroxyl group of the side chain of  $\beta$ S241 of  $\beta$ III-tubulin (i.e., 3.3 Å versus 2.8 Å). Furthermore, the side chain of  $\beta$ C241 existed in two alternate conformations suggesting flexibility. To investigate in depth the free energy difference of ligand binding to the two isoforms, we ran TI starting from both the  $\beta$ II-tubulin-plinabulin and  $\beta$ III-tubulin-plinabulin systems and performing forward and backward transformations. These calculations revealed a small but consistent difference in terms of binding free energy between the two systems and showed that plinabulin binding is slightly more stable in the colchicine site of  $\beta$ II-tubulin relative to that of  $\beta$ III-tubulin, possibly due to an entropic gain.

We next studied the binding kinetics with a particular focus on residence time. We calculated the residence time of plinabulin in both the  $\beta$ II- and  $\beta$ III-tubulin systems. Residence time is a measure of how long a compound stays in contact with its biological target and is emerging as a key parameter for drug discovery and development. It has been argued that the longer the residence time of a drug, the more efficacious the drug will be *in vivo*, and therefore, optimizing this parameter could provide better candidates for subsequent clinical trials.<sup>46,47</sup> We found that plinabulin unbinds slower from the  $\beta$ II- relative to the  $\beta$ III-tubulin system. The presence of  $\beta$ I318 in  $\beta$ II-tubulin versus  $\beta$ V318 in  $\beta$ III-tubulin increases the steric hindrance in the colchicine site and could be responsible for the longer residence time observed in  $\beta$ II-tubulin. The residence time is the inverse of the unbinding kinetics constant,  $k_{\text{off}}$ , and we could therefore conclude that the  $k_{\text{off}}$  of plinabulin is slower in the  $\beta$ II- than in the  $\beta$ III-tubulin system. Computational unbinding trajectories also prompted us to investigate the different routes plinabulin departed from the colchicine site to the solvent. In the vast majority of the trajectories, plinabulin leaves the colchicine site through a similar mechanism. A key role was played by the  $\beta$ T7 loop of  $\beta$ -tubulin that can modulate ligand unbinding; it most likely represents the main structural motif in tubulin governing the binding and unbinding kinetics of colchicine-site ligands, in agreement with previous findings.<sup>40</sup> Analyses of all the trajectories have also shown that plinabulin could adopt two possible poses, i.e., the crystallographic pose and a shifted one in which the compound is lodged into an adjacent, small hydrophobic pocket of the colchicine site, which has been recently described by X-ray crystallography.<sup>39</sup> In particular, our analysis indicates that the shifted pose is more likely to exist in  $\beta$ II-tubulin, while in  $\beta$ III-tubulin, the ligand is confined into the crystallographic pose. This difference in ligand mobility could be responsible for the different entropic gain of plinabulin binding to  $\beta$ II- than  $\beta$ III-tubulin. Importantly, biochemical assays performed to evaluate the selectivity of plinabulin versus the two tubulin isoforms confirmed our computational and structural outcomes, indicating that the compound displays a higher potency toward the  $\beta$ II- than the  $\beta$ III-tubulin isoform.

We may speculate that an interesting and perhaps pharmacologically relevant observation is that the nature of the binding of plinabulin within the colchicine site differs from that of colchicine and combretastatin-4A. As shown in Figure 1C, the benzyl and the diketopiperazine-imidazol moieties of plinabulin occupy zones 3 and 2 of the colchicine site, respectively. In contrast, the two archetypical colchicine-site drugs colchicine and combretastatin-A4 occupy zones 1 and 2 in a similar manner and overlap only little with plinabulin (Figure 1D). Notably, the  $\alpha$ T5 loop in the tubulin-plinabulin structure is in a “close” conformation, while the ones seen in the tubulin-colchicine and tubulin-combretastatin-A4 structures adopt a more “open” conformation to accommodate the respective ligands in zone 3 of the colchicine site (Figure 1D). These differences might contribute to the unique anti-CIN

effect of plinabulin (not demonstrated by either of the other MTAs), the good cardiac safety profile, and the activation of the immune-oncology system by plinabulin. These observations may lay the basis for subsequent investigations aimed at providing further clues about the relationships between the tubulin inhibition mechanism of plinabulin and its unique therapeutic profile.

Based on the present studies, we propose that plinabulin is more persistently bound to the colchicine site of  $\beta$ II-tubulin relative to that of  $\beta$ III-tubulin. This conclusion is supported by the following three main observations: (1) in  $\beta$ II-tubulin, plinabulin is lodged into a wider pocket with a possible entropic gain able to compensate for the higher force of the observed hydrogen bond with  $\beta$ S241 in  $\beta$ III-tubulin versus  $\beta$ C241 in  $\beta$ II-tubulin; (2) the plinabulin residence time is longer in  $\beta$ II- than  $\beta$ III-tubulin, showing that binding is more persistent within the  $\beta$ II-tubulin system, most likely because of the presence of  $\beta$ I318 in  $\beta$ II-tubulin versus  $\beta$ V318 in  $\beta$ III-tubulin; and (3) plinabulin is more active toward  $\beta$ II- relative to  $\beta$ III-tubulin in biochemical experiments. Overall, these observations may support the idea that plinabulin displays a higher potency toward  $\beta$ II-tubulin overexpressing cancer cells than those overexpressing  $\beta$ III-tubulin. Clearly, systematic cellular analyses with cancer cells overexpressing one of the two isotypes will be necessary to validate our predictions.

Next, we compared the residence time of plinabulin with that of two anti-tubulin compounds, colchicine and combretastatin-A4, using an SMD protocol and the high-resolution crystallographic structures of these molecules in complex with tubulin. SMD-based residence time of plinabulin ( $\sim$ 71 ns) is longer than that of the very fast scaled residence time of combretastatin-A4 ( $\sim$ 32 ns) and more similar to but slower than that of the long unbinding time of colchicine ( $\sim$ 97 ns; note that colchicine binding occurs in two steps, a fast binding step and a slow conformational change that locks the ligand into the binding site<sup>48</sup>). In patients, colchicine is associated with diarrhea, nausea, cramping, abdominal pain, and vomiting,<sup>49</sup> while combretastatin-A4 is associated with cardiovascular side effects<sup>17</sup> significantly beyond the transient (on the order of hours) hypertensive effects reported with plinabulin.<sup>16,50</sup> It is notable that the most common side effects of plinabulin in cancer patients are associated with the gastrointestinal system,<sup>16,50</sup> although far less severe than observed with colchicine. Our data therefore indicate a possible correlation of toxicity profile and residence time in colchicine binding, with long residence time associated with gastrointestinal toxicity and short residence time associated with cardiotoxicity. In this sense, plinabulin may approach an ideal balance allowing for establishing efficacy with an acceptable toxicity by achieving a residence time and gastrointestinal-cardiac toxicity profile midway between colchicine and combretastatin-A4. This may be further supported by reports that both colchicine<sup>18</sup> and combretastatin-A4<sup>19</sup> cause an adverse reduction in the number of circulating neutrophils (neutropenia), while plinabulin actually prevents neutropenia induced by chemotherapy.<sup>51</sup> These hypotheses will certainly need further experimental validations to gather a superior understanding of the complex mechanism(s) underlying associations between tubulin-binding versus effect profile.

## EXPERIMENTAL PROCEDURES

### Crystallization and X-Ray Data Collection

The recombinant tubulin was expressed and purified as previously described.<sup>27</sup> The bovine brain tubulin was purchased from the Centro de Investigaciones Biológicas (CSIC, Madrid, Spain). Proteins and crystals of the TD1 complex (a protein complex containing one tubulin dimer and the tubulin-binding darpin D1<sup>52</sup>) were prepared as

described previously.<sup>53</sup> Briefly, co-crystallization experiments were performed in parallel for bovine brain and recombinant tubulin by diluting a freshly prepared 50 mM plinabulin stock solution (in 100% DMSO) to 5 mM with the crystallization solution (100 mM Bis-TrisMethane, pH 5.5, supplemented with 200 mM ammonium sulfate and 25% PEG3350). 1  $\mu$ L of T $_{\beta$ II}D1 or T $_{\beta$ III}D1 at 15 mg/mL was mixed with 1  $\mu$ L of the 5 mM plinabulin and equilibrated against 400  $\mu$ L of the crystallization solution using the hanging drop vapor diffusion method. Crystals appeared overnight, were flash-frozen in liquid nitrogen, and were used directly for X-ray diffraction experiments at 100K at the X06DA beamline of the Swiss Light Source (Paul Scherrer Institut, Villigen, Switzerland) using a standard protocol.

### Structure Solution

Data processing was performed using the XDS software package.<sup>54</sup> Both the T $_{\beta$ II}D1-plinabulin and T $_{\beta$ III}D1-plinabulin complexes crystallized in the space group P12 $_1$ 1 with a single molecule in the asymmetric unit. Structure solution was performed by the molecular replacement method using a previously published TD1 structure (i.e., containing  $\alpha$ / $\beta$ II-tubulin as tubulin model; PDB ID 4DRX) after removing all the ligands and solvent molecules, by using the program PHASER in the PHENIX software package.<sup>55</sup> Similar to T $_{\beta$ II}D1-plinabulin, the T $_{\beta$ III}D1-plinabulin structure was solved by molecular replacement using the T $_{\beta$ II}D1-plinabulin structure without the ligand as a model. Plinabulin was added to the model using eLBOW in PHENIX, and its structure was further refined through iterative rounds of model building in Coot<sup>56</sup> and PHENIX. The quality of the structure was assessed with MolProbity<sup>57</sup>. Data collection and refinement statistics are presented in Table S1. Figures were prepared using PyMOL (The PyMOL Molecular Graphics System, Version 2.2.3. Schrödinger).

### Structural Models for Computational Studies

In this work, we employed two molecular systems, namely  $\beta$ II-tubulin-plinabulin and  $\beta$ III-tubulin-plinabulin. The two complexes were prepared, starting from the solved T $_{\beta$ II}D1-plinabulin and T $_{\beta$ III}D1-plinabulin X-ray crystal structures after the removal of the tubulin-binding darpin D1. Missing residues and loops were built using the PDB ID 5LYJ as template.<sup>40</sup> The co-crystallized GTP, GDP, Mg<sup>2+</sup>, and plinabulin were retained as well as the water molecules in the plinabulin-binding site. To parameterize the GTP and GDP cofactors, we employed the available parameters from the Amber database.<sup>58</sup> BiKi Life Sciences suite<sup>59</sup> was employed to parameterize plinabulin. Charges were computed at HF/6-31G\* level of theory and fitted via the RESP procedure,<sup>60</sup> while the General Amber Force Field (Gaff)<sup>61</sup> was employed to parameterize the bonded and vdW terms of plinabulin. Tubulin, instead, was parameterized using Amber14SB force field.<sup>62</sup> These two final structures were employed for both TI and MM/GBSA calculations.

In the case of SMD simulations, the C-terminal tails were included in both the  $\alpha$ - and  $\beta$ -tubulin subunits, and these two systems are referred to as  $\beta$ II-tubulin-tail-plinabulin and  $\beta$ III-tubulin-tail-plinabulin. Since the predicted unbinding times might be affected by the electrostatic environment of the systems, we decided to include the highly negatively charged C-terminal tails in order not to neglect their possible influence in the plinabulin residence time. The preparation of these two systems, as well as the preparation of the  $\beta$ II-tubulin-colchicine and  $\beta$ II-tubulin-combretastatin A-4 systems, are reported in the Supplemental Information.

### MM/GBSA Calculations

We performed MM/GBSA calculations to compare the binding free energy (i.e.,  $\Delta G_{\text{bind(MMPBSA)}}$ ) between plinabulin and the  $\beta$ II- and  $\beta$ III-tubulin systems. The final

$\Delta G_{\text{bind(MMPBSA)}}$  estimation is averaged using a trajectory of classical MD simulations of both  $\beta$ II-tubulin-plinabulin and  $\beta$ III-tubulin-plinabulin systems. The two parameterized systems (see the previous section) were solvated using TIP3P<sup>63</sup> waters and neutralized adding  $\text{Na}^+$  counterions using the tleap module in AmberTools17. The equilibration of both  $\beta$ II-tubulin-plinabulin and  $\beta$ III-tubulin-plinabulin systems consisted of six steps: (1) minimization of water molecules combining steepest descent and conjugate gradient methods, restraining the complex; (2) 20 ps at 300 K to relax the water molecules, while the complex is still restrained; (3) minimization of whole system combining steepest descent and conjugate gradient methods; (4) heating of the system in 500 ps in NVT ensemble, reaching a target temperature of 300 K using Berendsen thermostat,<sup>64</sup> restraining the complex; (5) adjusting the density of the system in 500 ps in NPT ensemble. A target temperature of 1 bar was reached using Berendsen barostat, while temperature was regulated using Langevin dynamics and a collision frequency  $\gamma$  of  $2 \text{ ps}^{-1}$ . Also in this case, the complex was maintained restrained; (6) final 5 ns in NPT using the same settings as in (5) and releasing the restraints. After the equilibration, 100 ns of plain MD simulations in NPT ensemble were run for each of the two systems. The simulations were run by means of pmemd engine, implemented in Amber 16. For MM/GBSA estimation, we extracted one frame every 400 ps from the original trajectory, for a total of 250 frames. To run MM/GBSA analysis, we employed the MMPBSA.py Python script present in Amber16, employing the mbondi2 radii and using a modified GB model developed by Onufriev et al.<sup>65</sup>

### Free Energy Differences via Thermodynamic Integration Calculations

In this study, we performed thermodynamic integration (TI) calculations to estimate the relative binding free energy difference between plinabulin and the  $\beta$ II-tubulin-plinabulin and  $\beta$ III-tubulin-plinabulin systems, see [Structural Models for Computational Studies](#)). To do so, we took advantage of multi-step alchemical transformations to gradually transform the plinabulin-binding site from  $\beta$ II- to  $\beta$ III-tubulin and vice versa, upon the mutation of two side chains: the  $\beta$ C241 and  $\beta$ I318 that are transformed into  $\beta$ S241 and  $\beta$ V318, respectively, in the case of  $\beta$ II  $\rightarrow$   $\beta$ III transformation; and  $\beta$ S241 and  $\beta$ V318 that are transformed into  $\beta$ C241 and  $\beta$ I318 in the case of  $\beta$ III  $\rightarrow$   $\beta$ II transformation. The free energy loss or gain associated to these transformations are computed via the TI formalism<sup>66</sup> (see below).

We performed a total of 8 alchemical transformations, as reported in [Table 1](#) and [Figure 2](#). Four transformations have as starting point the  $\beta$ II-tubulin-plinabulin system. Here, the  $\beta$ II-tubulin-binding site is gradually transformed into  $\beta$ III-tubulin by first mutating  $\beta$ C241 to a serine ( $\beta$ II/TR<sub>1</sub>) and then mutating  $\beta$ I318 to valine ( $\beta$ II/TR<sub>2</sub>). Also, the backward transformations are performed ( $\beta$ II/TR<sub>3</sub> and  $\beta$ II/TR<sub>4</sub>). The remaining four transformations, instead, have as starting point the  $\beta$ III- and  $\beta$ III-tubulin-plinabulin systems. Here, the  $\beta$ III-tubulin-binding site is gradually transformed into  $\beta$ II-tubulin by first replacing  $\beta$ S241 to a cysteine ( $\beta$ III/TR<sub>1</sub>) and then mutating  $\beta$ V318 to an isoleucine ( $\beta$ III/TR<sub>2</sub>). Also in this case, the backward transformations are carried out ( $\beta$ III/TR<sub>3</sub> and  $\beta$ III/TR<sub>4</sub>). For each of the 8 transformations, we employed the same simulations protocol that is detailed in the [Supplemental Information](#).

### Scaled MD Simulations

The solvated  $\beta$ II-tubulin-tail-plinabulin and  $\beta$ III-tubulin-tail-plinabulin systems (see the [Supplemental Information](#)) were first equilibrated using the same protocol employed for the modeling of the tubulin with the C-terminal tails (see the [Supplemental Information](#)). Then, 20 SMD simulations for each system were carried out



using a scaling factor of 0.4 and restraining the GTP, the GDP, the  $Mg^{2+}$  and the protein's backbone, with weak positional restraints whose harmonic force constant was set  $50 \text{ kJ mol}^{-1} \text{ nm}^{-2}$  to prevent the unfolding of the protein. We excluded from this selection all the residues  $6 \text{ \AA}$  from plinabulin along with residues forming the unbinding channel, which connects the binding pocket to the bulk of the solvent (see the [Supplemental Information](#)). We computed the residence time of plinabulin and the associated standard error (SE) in both the  $\beta$ II- and  $\beta$ III-tubulin systems, averaging the residence time of the 20 SMD simulations and performing a bootstrap analysis as reported in the study of Mollica et al.<sup>33</sup> The same procedure was then utilized for colchicine and combretastatin-A4 for making a comparison, in terms of residence time, among different colchicine-site inhibitors (see the [Supplemental Information](#) for further details).

### Differential Effect of Plinabulin on $\beta$ II- and $\beta$ III-tubulin

Samples containing  $60 \mu\text{M}$  bovine brain tubulin (58%  $\beta$ II, 25%  $\beta$ III, and 17% other tubulin isotypes;<sup>30</sup>) were incubated in GAB buffer (3.4 M glycerol, 10 mM sodium phosphate, 1 mM EGTA, 1 mM GTP, pH 6.7) at 37 C for 1 h in the absence or presence of  $5 \mu\text{M}$  plinabulin. The samples were then centrifuged for 20 min at 5,000 rpm in a Beckman Optima TLX in  $200 \mu\text{L}$  polycarbonate tubes. Supernatants were collected, and pellets were resuspended in GAB buffer. The amount of protein in the supernatants and pellets were quantified by the bicinchoninic acid (BCA) assay<sup>67</sup> in order to load equal amounts of tubulin in each well. For western blots, 1 or  $0.2 \mu\text{g}$  of tubulin was load per well of a 15% SDS-PA Gel. Samples (3 $\times$ ) were subject to SDS-PAGE and transferred to a nitrocellulose membrane using the Trans-Blot® Turbo Blotting System (Bio-rad) for 10 min. The membranes were blocked by incubation with 6% milk in phosphate-buffered saline (PBS) 0.1 % Tween 20 at room temperature for 1 h. Then they were incubated with the primary antibodies anti- $\beta$ II (Sigma-Aldrich, 1/200) and anti- $\beta$ III (Sigma-Aldrich, 1/1,500) at 4°C overnight. Membranes were washed three times with PBST for 10 min and incubated with the secondary antibody (donkey a-mouse, 1/10,000) for 1 h at room temperature. Finally, the membranes were washed three times with PBST for 10 min and exposed with the ECL reagent. Images were taken using a ChemiDoc™ instrument (Bio-rad) and analyzed with the Image Lab 5.2.1 software (Bio-rad).

### SUPPLEMENTAL INFORMATION

Supplemental Information can be found online at <https://doi.org/10.1016/j.chempr.2019.08.022>.

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### AUTHOR CONTRIBUTIONS

L.H., J.R.T., G.K.L., J.F.D., M.O.S., and A.C. designed the research. G.L.S., N.O., A.S., F.V., F.D. A.B.P., and S.D. performed experiments. All the authors analyzed the data and wrote the paper.

## DECLARATION OF INTERESTS

The authors declare the following financial interests: L.H., J.K.L., and J.R.T. are employed by BeyondSpring Pharmaceuticals and have an equity (stock) interest in the company.

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**Chem, Volume 5**

**Supplemental Information**

**Structure, Thermodynamics,**

**and Kinetics of Plinabulin**

**Binding to Two Tubulin Isoforms**

**Giuseppina La Sala, Natacha Olieric, Ashwani Sharma, Federica Viti, Francisco de Asis Balaguer Perez, Lan Huang, James R. Tonra, G. Kenneth Lloyd, Sergio Decherchi, José Fernando Díaz, Michel O. Steinmetz, and Andrea Cavalli**

## Supplemental Experimental Procedures

**Modeling of tubulin with C-terminal tails.** To account for a possible influence of the negatively charged, disordered C-terminal tail regions of  $\alpha$ - and  $\beta$ -tubulin on the residence time of the ligands, we modeled these elements to obtain the two new biomolecular systems namely  $\beta$ II-tubulin-tail-plinabulin and  $\beta$ III-tubulin-tail-plinabulin. Starting from  $\beta$ II-tubulin-plinabulin and  $\beta$ III-tubulin-plinabulin systems, we manually added the missing residues of the  $\alpha$ - and  $\beta$ -subunits letting them to adopt a starting 3D extended conformation. Using the BiKi Life Sciences suite<sup>1</sup>, we solvated the systems using TIP3P<sup>2</sup> water molecules, leaving a buffer of 12 Å between the solute and the box edges. Each solvated system was then neutralized by replacing water molecules with an appropriated number of Na<sup>+</sup> counter ions. The final complexes were minimized and equilibrated to reach a target temperature of 300 K and a final pressure of 1 bar. Three simulations of 500 ps each were run in the NVT ensemble, using the velocity rescaling thermostat to gradually heat the system to 100, 200 and 300 K. The protein backbone and the ligands heavy atoms (i.e., plinabulin, GTP, GDP and Mg<sup>2+</sup>) were restrained using a harmonic restraint with force constant of 1000 kJ mol<sup>-1</sup> nm<sup>-2</sup>. The last equilibration step of 500 ps was run in the NPT ensemble to adjust the density of the system, using the velocity rescaling thermostat<sup>3</sup> and the Parrinello-Rahman barostat,<sup>4</sup> (releasing the restraints). Finally, ~140 ns of SMD simulations using a scaling factor of 0.8 were carried out to enhance the exploration of the conformational space of the two C-terminal tails. To avoid the unfolding of the protein, weak positional restraints (harmonic force constant = 50 kJ mol<sup>-1</sup> nm<sup>-2</sup>) were applied to the ligands and to the backbone of the protein, with the exception of the two C-terminal tails. The P-LINCS algorithm<sup>5</sup> was employed to restraint bonds involving hydrogen atoms in their equilibrium length. Long-range electrostatics were treated with the Particle mesh Ewald (PME) method,<sup>6</sup> while periodic boundary conditions were applied in the three dimensions. Both system equilibration and SMD simulations were performed using the BiKi Life Sciences suite. In order to retrieve the most probable final conformations of both the  $\alpha$ - and  $\beta$  subunit C-terminal tails, we run a cluster analysis on the SMD trajectory, where we extracted the medoids of the most populated clusters. These two medoids were used as starting points for the next SMD simulations.

**Models of  $\beta$ II-tubulin in complex with colchicine and combretastatin A-4.** Besides plinabulin, we also investigated the kinetic profiles of the two tubulin inhibitors colchicine and combretastatin A-4 in complex with  $\beta$ II-tubulin. These two systems are referred to as  $\beta$ II-tubulin-colchicine and  $\beta$ II-tubulin-combretastatinA-4. The two systems were prepared starting from the PDB codes 4O2B and 5LYJ, removing the other crystallographic protein units (i.e., stathmin-like protein RB3 and tubulin tyrosine ligase). The missing residues present in the X-ray structures were filled using the "fix structure" tool implemented in the BiKi suite. The missing C-terminal tails were built using as template the  $\beta$ II-tubulin-tail-plinabulin system. Also in this case, the protein in both the  $\beta$ II-tubulin-colchicine and  $\beta$ II-tubulin-combretastatinA-4 systems was parameterized with the Amber ff14SB force field<sup>7</sup>, whereas the GTP and GDP parameters were retrieved from the Bryce database (<http://research.bmh.manchester.ac.uk/bryce/amber>).<sup>8</sup> The charges of colchicine were computed using BiKi at HF/6-31G\* level of theory and fitted via the RESP procedure<sup>9</sup>, while the General Amber Force Field (Gaff)<sup>10</sup> was employed to parameterize the bonded terms. The combretastatin A-4 parameters were

the ones used in Gaspari et al.<sup>11</sup> For both systems, we employed the same procedure mentioned above for solvating and neutralizing the systems.

**Selection of restraints in SMD simulations.** In order to define the unrestrained residues for SMD simulations, we performed a preliminary analysis to identify a possible channel within the tubulin dimer that might favor unbinding of the ligands (i.e., plinabulin, colchicine and combretastatin A-4). In particular, we performed a ~90 ns long SMD using the  $\beta$ II-tubulin-tail-plinabulin system applying a scaling factor of 0.45 and applying weak positional restraints (harmonic restraints force constant = 50 kJ mol<sup>-1</sup> nm<sup>-2</sup>) to the GTP, GDP and the protein's backbone with the exception of the residues 6 Å away from plinabulin. Then, we run the PockeTron tool<sup>12</sup> implemented in the BiKi 1.3 suite,<sup>1</sup> to identify and track all the pockets formed along SMD simulations. We used a radius 3 and 1.5 Å for the big and the small probe, respectively, and discarded from the analysis all the pockets that are smaller than the volume occupied by 3 water molecules. Using this approach, we were able to identify putative channels that might help the departure of the ligands from the colchicine site and that are not detectable by only the visual inspection of crystallographic structures. Therefore, we added to the previously mentioned unrestrained residues also the residues that formed these new channels. The unrestrained residues were:  $\alpha$ Q176,  $\alpha$ V177,  $\alpha$ S178,  $\alpha$ T179,  $\alpha$ A180,  $\alpha$ T223,  $\alpha$ Y224,  $\alpha$ T225,  $\alpha$ I455,  $\beta$ F20,  $\beta$ V51,  $\beta$ Y52,  $\beta$ Q136,  $\beta$ I165,  $\beta$ N167,  $\beta$ F169,  $\beta$ E200,  $\beta$ Y208,  $\beta$ V238,  $\beta$ T239,  $\beta$ T240,  $\beta$ S241,  $\beta$ L242,  $\beta$ R243,  $\beta$ F244,  $\beta$ P245,  $\beta$ G246,  $\beta$ Q247,  $\beta$ L248,  $\beta$ N249,  $\beta$ A250,  $\beta$ D251,  $\beta$ L252,  $\beta$ L255,  $\beta$ M259,  $\beta$ V315,  $\beta$ A316,  $\beta$ T317,  $\beta$ V318,  $\beta$ F319,  $\beta$ R320,  $\beta$ G321,  $\beta$ R322,  $\beta$ M323,  $\beta$ S324,  $\beta$ M325,  $\beta$ P348,  $\beta$ N349,  $\beta$ N350,  $\beta$ V351,  $\beta$ K352,  $\beta$ V353,  $\beta$ A354,  $\beta$ V355,  $\beta$ C356,  $\beta$ D357,  $\beta$ T376,  $\beta$ I378 ( $\beta$ III-tubulin X-ray numbering, see Figure S3). For consistency, we adopted the same set of unrestrained residues for all SMD simulations.

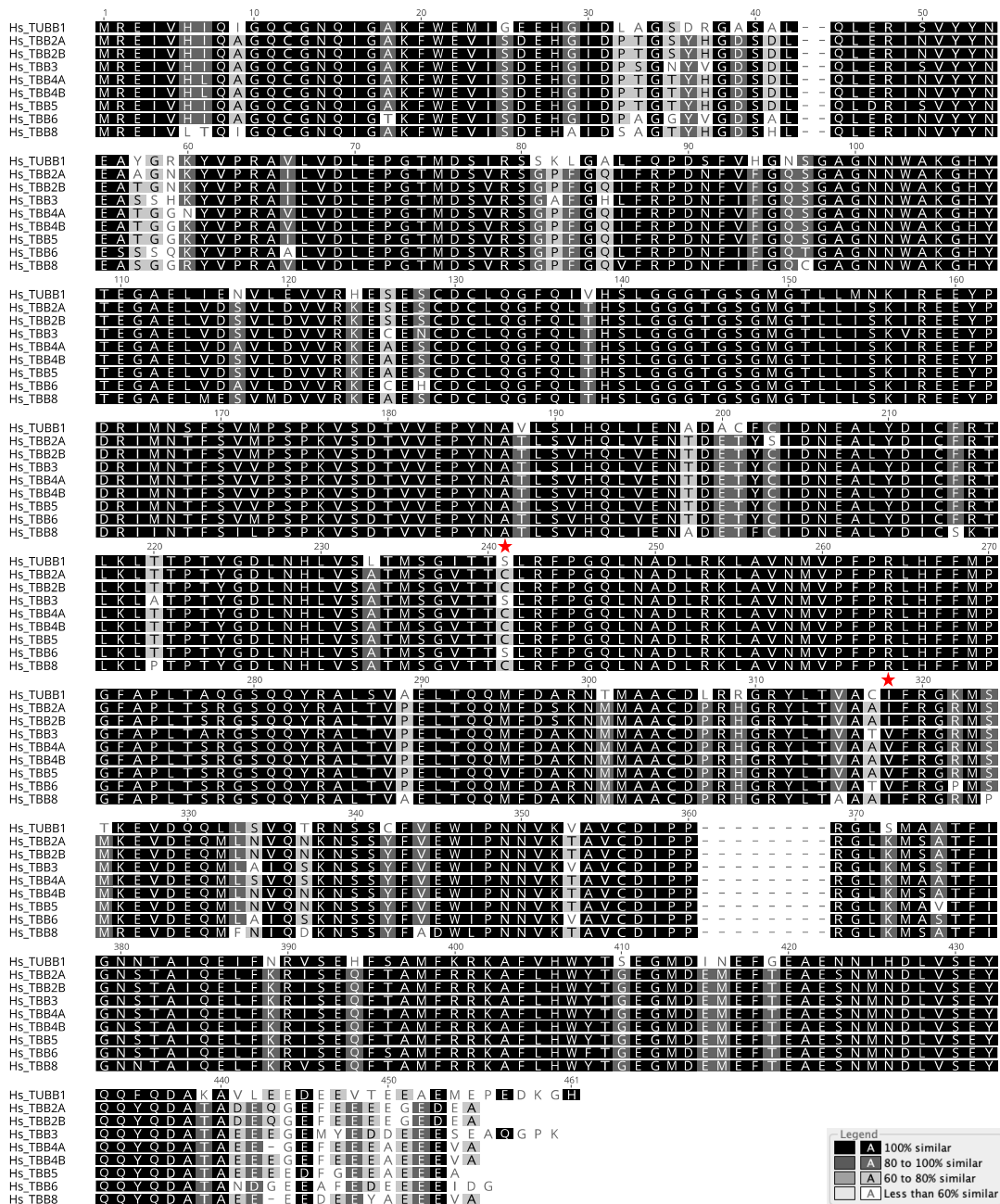
**Thermodynamic integration protocols.** For each of the 8 transformations (i.e.  $\beta$ II/TR<sub>1</sub>,  $\beta$ II/TR<sub>2</sub>,  $\beta$ II/TR<sub>3</sub>,  $\beta$ II/TR<sub>4</sub>,  $\beta$ III/TR<sub>1</sub>,  $\beta$ III/TR<sub>2</sub>,  $\beta$ III/TR<sub>3</sub> and  $\beta$ III/TR<sub>4</sub>) we employed the same simulative protocol. The starting system was firstly equilibrated at  $\lambda = 0.5$ . The equilibration consisted of a minimization, a 20 ps long thermalization at 300 K using the Berendsen thermostat and a 40 ps short equilibration to adjust the density of the system using again the Berendsen barostat.<sup>13</sup> The coordinates of the equilibrated system at  $\lambda = 0.5$  were used as starting point for the simulations for the other  $\lambda$  values. For each transformation, we run 11 simulations for the tubulin-plinabulin complex and 11 simulations for the protein alone (see Figure 2). We used a window size of  $\Delta\lambda = 0.1$ , where the starting system is  $\lambda = 0.0$  and the final system is  $\lambda = 1.0$ . For each  $\lambda$  value, 200 ps of constant volume equilibration was followed by 10 ns of constant pressure production. The starting systems for the first two transformations (i.e.,  $\beta$ II/TR<sub>1</sub> and  $\beta$ III/TR<sub>1</sub>) are  $\beta$ II-tubulin-plinabulin and  $\beta$ III-tubulin-plinabulin (see above), while the intermediate starting systems for other transformations were modeled by manually mutating the residue of interest.

For each transformation, the free energy ( $\Delta G$ ) associated to move from the initial to the final one is:

$$\Delta G = \int_0^1 \left\langle \frac{\delta U}{\delta \lambda} \right\rangle d\lambda \quad (1)$$

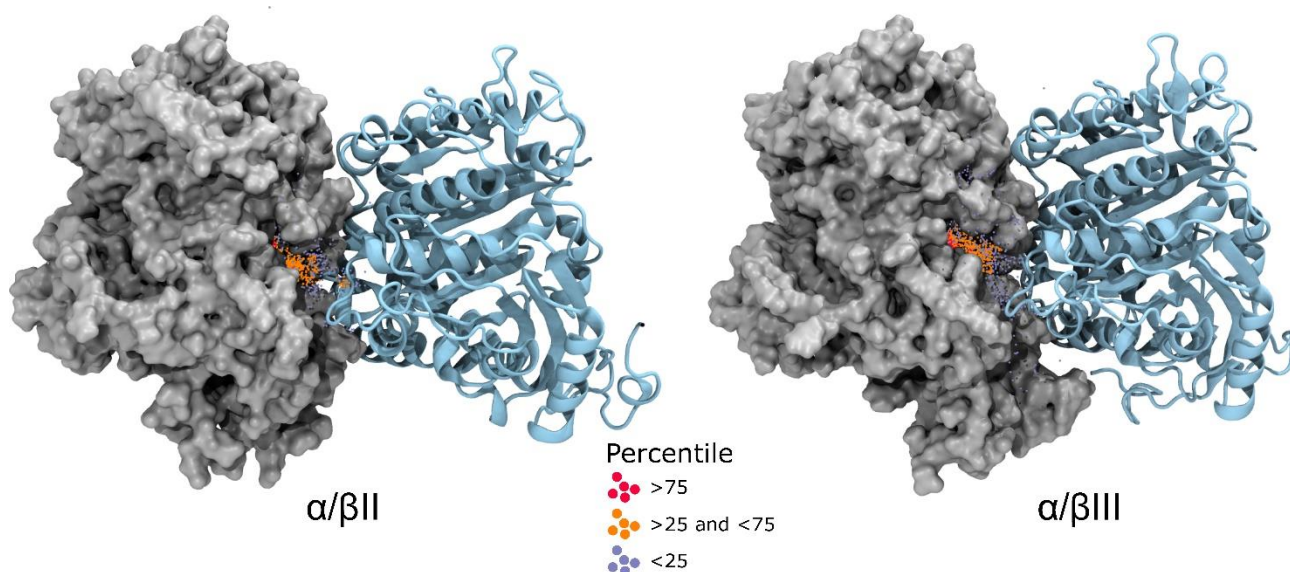
where U is the potential energy of the system and  $\lambda$  is the parameter that varies the potential from the initial state ( $\lambda=0.0$ ) to the final state ( $\lambda=1.0$ ). Therefore, according to the alchemical cycle depicted in Figure 2, the binding free energy difference of plinabulin from protein A to protein B is:  $\Delta\Delta G_{\text{bind}[A-B]} = \Delta G_{\text{bound}[A-B]} -$

$\Delta G_{\text{unbound[A-B]}}$ , where the first term corresponds to the free energy gained/lost computed with formula (1) to transform the protein from the initial (A) to the final state (B) when in complex with the ligand, whereas the second term is analogous but the ligand is not bound to the protein. The convergence of TI simulations was assessed by estimating the  $\Delta\Delta G_{\text{bind}}$  as a function of the simulation time,<sup>8</sup> interrupting the MD simulations when the  $\Delta\Delta G_{\text{bind}}$  values reached the plateau as depicted in Figure S4. All the simulations were performed using a single-step approach, where electrostatic and the van der Waals softcore potential terms are switched at the same time for each  $\lambda$  value. Simulations were performed using the pmemd module implemented in Amber16.<sup>15</sup>

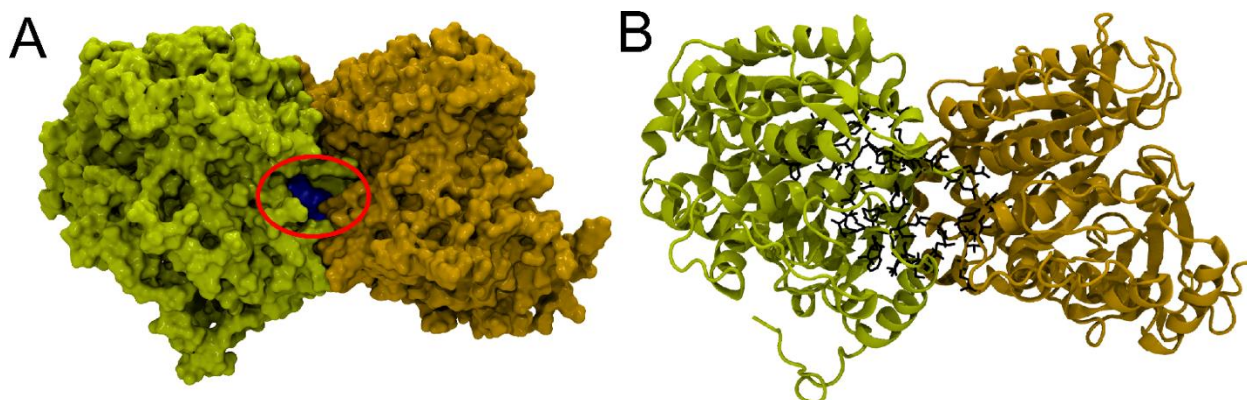


**Figure S1.** Alignment of human  $\beta$ -tubulin isoforms (uniprot codes of the sequences from top to bottom in the alignment: Q9H4B7, Q13885, Q9BVA1, Q13509, P04350, P68371, P07437, Q9BUF5, Q3ZCM7) using Geneious Prime (Biomatters Ltd.). Red stars on top of the alignment highlights amino acid differences involved in plinabulin binding. Gaps were introduced manually to match residues numbering with alpha tubulin as defined by Lowe et al.<sup>16</sup>

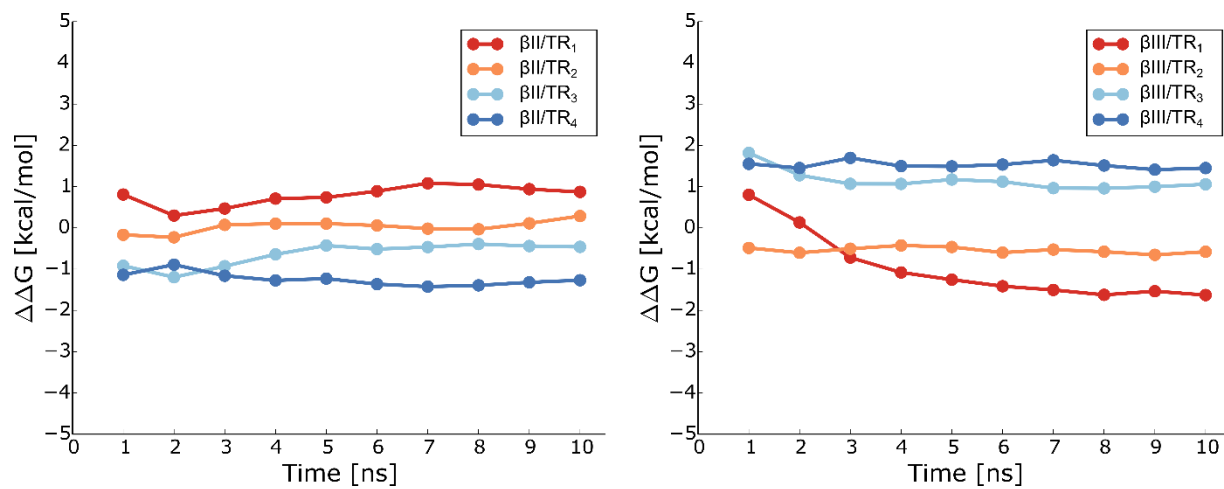




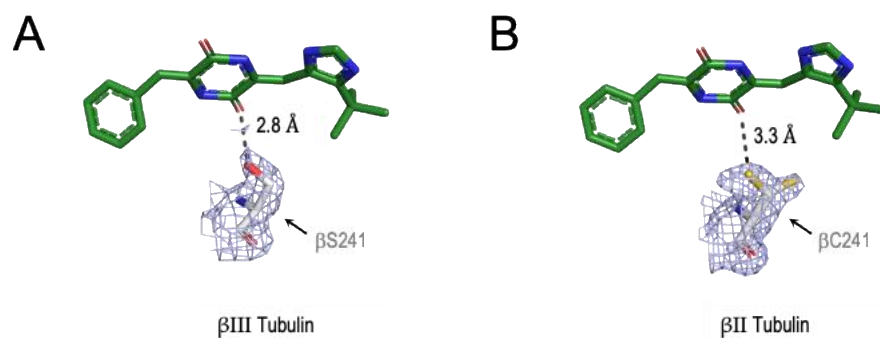
**Figure S2.** Representation of the probability of finding the COM (center of mass) of plinabulin for the  $\beta\text{II}$ - (left side) and  $\beta\text{III}$ - tubulin (right side) systems computed along the SMD trajectories. Each point represents the spatial localization of plinabulin's COM according to the following color scheme: red has a probability of >75 percentile, orange has a probability within 25 and 75 percentile, and indigo has probability <25 percentile.



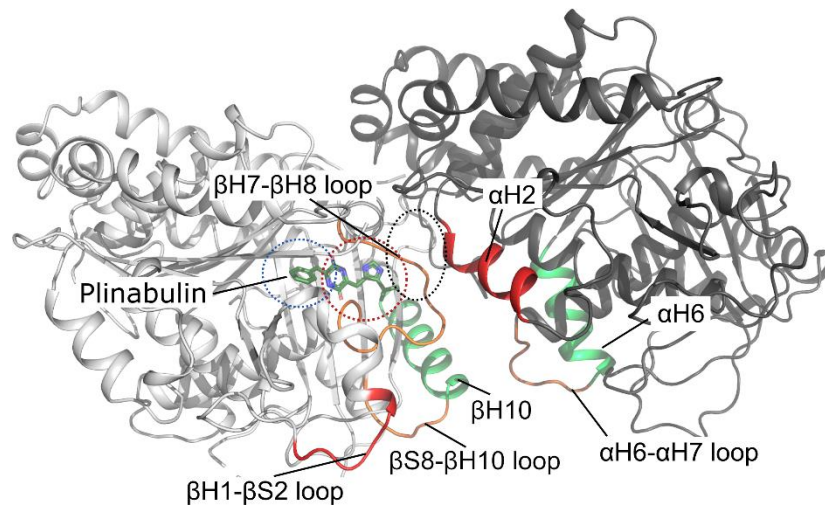
**Figure S3.** A) Representation of the  $\alpha$  (orange) and  $\beta$  (yellow) chains of the  $\beta\text{II}$ -tubulin system. The blue pocket circled in red represents the possible departure channel of the binders of the colchicine site. The structure belongs to a representative frame extracted from SMD simulations. B) In black sticks the residues of both the colchicine site and the departure channel that are not restrained in the SMD trajectories of the  $\beta\text{II}$ -tubulin-tail-plinabulin,  $\beta\text{III}$ -tubulin-tail-plinabulin,  $\beta\text{II}$ -tubulin-tail-colchicine and  $\beta\text{II}$ -tubulin-tail-combretastatinA-4 systems are represented.



**Figure S4.** Free energy convergence in time for both the four transformations related to  $\beta_{II} \rightarrow \beta_{III}(\beta_{II_{mut-2}})$  in the left panel and the four transformations related to  $\beta_{III} \rightarrow \beta_{II}(\beta_{III_{mut-2}})$  in the right panel.



**Figure S5.** Electron density showing the conformation of the S241 side chain in the  $T_{\beta_{III}D1}$ -plinabulin structure (A) and the C241 side chain in the  $T_{\beta_{II}D1}$ -plinabulin structure (B). Plinabulin is shown in green sticks representation. Electron densities are displayed using a sigma A weighted 2Fo-Fc map contoured at 1.0 level using Pymol.



**Figure S6.** Representation of the three exit pathways evidenced in our SMD simulations. The alpha and the beta tubulin are represented in grey and white cartoon, respectively. We oriented the dimer in the same way as in Figure 1 of the main text and adopted the same colors for the exit pathways as in Figure 3 of the main text. The colored circles in the Plinabulin binding site represent zone 1,2 and 3 (black, red and blue, respectively). The orange, red and green portions of the protein represent, instead, the path A, B and C.

Data Collection <sup>a</sup>	T <sub>βII</sub> D1-Plinabulin	T <sub>βIII</sub> D1-Plinabulin
Wavelength, Å	1	1
Space group	P 1 21 1	P 1 21 1
Resolution range, Å	45.02 – 1.519 (1.574 - 1.519)	45.6 – 1.801 (1.865 – 1.801)
Unit cell a, b, c (Å) , , (°)	73.565 91.351 83.221 90 96.851 90	73.63 91.2 82.64 90 97.493 90
No. of observed reflections	1127765 (103861)	651489 (60526)
No. of unique reflections	166365 (15828)	98394 (5181)
Mean I/sigma(I)	16.43 (1.21)	11.04 (1.29)
R-merge	0.05515 (1.52)	0.1429 (1.894)
R-meas	0.05971 (1.648)	0.1555 (2.071)
CC1/2 <sup>b</sup>	0.999 (0.683)	0.996 (0.419)
CC*	1 (0.901)	0.999 (0.768)
<b>Refinement</b>		
R-work	0.1764 (0.3644)	0.2256 (0.3567)
R-free	0.2023 (0.3726)	0.2622 (0.3658)
Macromolecules	8072	7817
Ligands	86	87
Protein residues	1017	999
RMS (bonds) (Å)	0.008	0.011
RMS (angles) (°)	1.13	1.26
Ramachandran favored (%) <sup>c</sup>	98.61	98.27
Ramachandran outliers (%) <sup>c</sup>	0	0
<b>B-factors</b>		
Average B-factor	37.17	25.51
Macromolecules	36.35	25.01
Ligands	27.68	17.21
Solvent	45.45s	31.45

<sup>a</sup> Highest resolution shell statistics are in parentheses.

<sup>b</sup> As defined by Karplus and Diederichs.<sup>17</sup>

<sup>c</sup> As defined by MolProbity.<sup>18</sup>

**Table S1.** X-Ray data collection and refinement statistics.

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