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Comprehensive Analysis of Binding Sites in Tubulin

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Abstract: Tubulin plays essential roles in vital cellular activities and is the target of a wide range of proteins and ligands. Here, using a combined computational and crystallographic fragment screening approach, we addressed the question of how many binding sites exist in tubulin. We identified 27 distinct sites, of which 11 have not been described previously, and analyzed their relationship to known tubulin-protein and tubulin-ligand interactions. We further observed an intricate pocket communication network and identified 56 chemically diverse fragments that bound to 10 distinct tubulin sites. Our results offer a unique structural basis for the development of novel small molecules for use as tubulin modulators in basic research applications or as drugs. Furthermore, our method lays down a framework that may help to discover new pockets in other pharmaceutically important targets and characterize them in terms of chemical tractability and allosteric modulation.

Introduction

Microtubules are dynamic cytoskeletal filaments, which are assembled from and disassembled into their $\alpha\beta$ -tubulin

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heterodimeric building blocks. An outstanding property of tubulin is its capacity to bind a plethora of regulators, whose main activities are to modulate microtubule dynamics and organization, and consequently microtubule function. In cells, it is targeted by diverse proteins that enable microtubules to control fundamental physiological processes in all eukaryotes ranging from cell division, cell motility, cell polarity to intracellular trafficking (reviewed in ref. [1]). In addition, a large number of chemically diverse, small molecule ligands bind to six so far identified, distinct binding sites in tubulin (reviewed in ref. [2]). Notably, compounds that interfere with the function of tubulin have been very successfully used to treat human pathologies including cancer, infectious diseases and neurological disorders, but also in basic research studies aimed at understanding cell physiology (reviewed in ref. [3]).

The observation that tubulin can bind so many different proteins and ligands raises the intriguing question of how many different binding sites do exist in tubulin. Here, we addressed this question using a combined computational and crystallographic fragment screening approach. Our study provides a comprehensive analysis of binding sites in tubulin, and offers a unique structural and mechanistic framework for novel antitubulin ligand design and engineering approaches.

Results

Computational Analysis

We initially performed a 1.1 µs-long molecular dynamics (MD) simulation in explicit solvent with a high-resolution crystal structure of the bovine brain $\alpha\beta$ -tubulin heterodimer, which is predominantly composed of the α 1- and β 2-tubulin isotypes. The root mean square deviation (RMSD) of the C α carbon atoms of the tubulin structure compared to the starting structure stabilized after 400 ns of the simulation and oscillated around 2.7 Å for the remaining time of the simulation (Figure S1). However, without taking the long loops H1-S2, S7-H9 (M-loop), and S9-S10 of both the α - and β -tubulin monomers into account (see ref. [5] for designation of secondary structure elements and residue numbering), the stability was achieved after only 100 ns of simulation with an average RMSD of 1.8 Å (Figure S1).

Next, we computationally identified pockets in tubulin, analyzed their relative dynamics and persistency, and assessed their communication networks by tracking the exchange of atoms between adjacent pockets during the entire course of the simulation. For the description of the predicted pockets, we arbitrarily gave them an identifier (pID) by numbering them consecutively with roman numbers in both the α - and β -





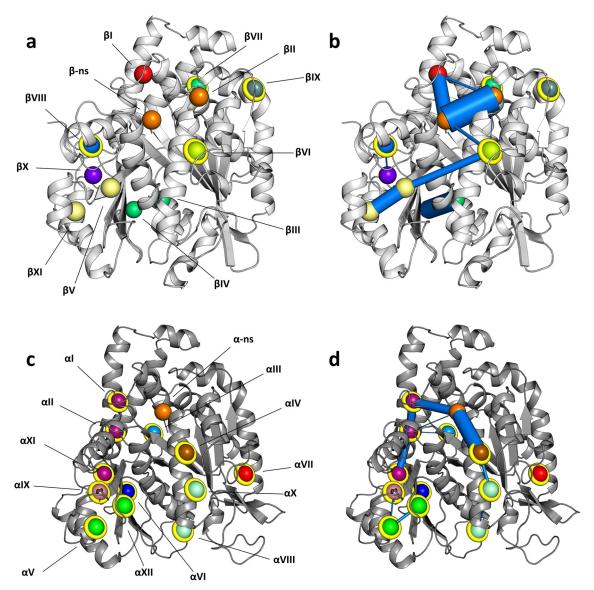


Figure 1. Tubulin pockets and their communication networks predicted by MD simulation. a, c) Predicted pockets in β-tubulin ((a), light gray ribbon representation) and α -tubulin ((c), dark gray ribbon representation). b, d) Predicted pocket communication networks in β-tubulin (b) and α -tubulin (d). Marine blue lines depict connected network nodes; their widths are displayed proportional to the respective communication frequency between two nodes. Spheres represent center of masses of the pockets (corresponding to network nodes) and are shown in different colors. Identical colors indicate pockets that are often merged during the simulation. Spheres coated with yellow rings highlight novel sites. See also Table S1.

tubulin monomers. An overview of the location of the pockets in α - and β -tubulin is given in Figure 1a,c and selected features of all pockets are collected in Table 1 and Table S1. An illustration of the dynamic crosstalk between pockets is illustrated in Figure 1b,d and the involved residues are highlighted in Table S1. In the following, we first describe the pockets observed in β -tubulin and then those in α -tubulin.

The first pocket on β -tubulin that attracted our attention is pID β II, which displays a persistency value (p) of 99%. Even though the presence of this pocket may also be influenced by the adjacent β -phosphate group of the bound GDP, its boundaries leave enough space to accommodate the γ -phosphate group when the β -nucleotide site is occupied by GTP or an inorganic phosphate molecule in the case of GDP-Pi. Two pockets, pID β V and β XI (p=98%) and 41%,

respectively) belong to the structurally well-characterized taxane site of β -tubulin. [4,6] They merged along 30% of the simulation to give raise to a single, wider pocket. Other pockets that belong to known β -tubulin sites comprise the colchicine site [7] (pID β III and β IV; both with p=100%), an allosteric pocket of the maytansine site [8] (pID β I; p=58%), which accommodates the C15-C33 moiety of the phase II anticancer drug plocabulin (PM060184[8,9]), and the laulimalide/peloruside site [10] (pID β X, p=46%).

A prominent pocket in β -tubulin is pID β VI ($p=52\,\%$), which is formed by residues of helices β H1, β H2, and β H7. Intriguingly, it acts as a bridge between the taxane-site pocket pID β V and the β -nucleotide site. This predicted crosstalk between these two sites is in line with biochemical results demonstrating that the presence of a ligand in the taxane site



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Table 1: Pockets and sites identified by MD and crystallographic fragment screening, respectively.

$Pocket^{[a]}$	Site ^[b]	Shared SS ^[c]	Notes ^[d]
pID βI	sID βαΙΙΙ (22)	βТ5, βН5, βН11 *	Extension of the vinblastine site; targeted by the C15-C33 moiety of plocabulin
pID βII	_	_	γ-phosphate site of the guanosine nucleotide
pID βIII	sID βIV (16)	βS4, βS5, βH5-S6, βS6, βH7, βT7, βH8, βS7, βS8, βS10	
pID βIV	sID βIV (16)	βΤ7, βΗ8, βS8, βS9	Colchicine site; equivalent to pID $lpha$ VI
pID βV	sID βII (2)	βΗ1, βS7, βΜ, βS8, βS9-S10, βS10	Taxane site
pID βVI	_	_	Novel; mediating communication between β -ns and the taxane site; equivalent to pID α IV
pID βVII	_	_	Novel
pID βVIII	sID βI (2)	βН6, βН9-Ѕ8	Targeted by TPX2; equivalent to pID α IX
pID βIX	_	_	Novel
pID βX	_	_	Part of the laulimalide/peloruside site
pID βXI	sID βII (2)	βM, βS9-S10, βS10 *	Taxane site
_	sID βIII (1)	-	Novel
_	sID βV (8)	-	Targeted by dynein and CPAP
_	sID βαΙ (3)	-	Targeted by tau, TPX2, kinesin-13, <i>Ustilago maydis</i> kinesin-5 and iE5 alphaRep
-	sID βαΙΙ (16)	-	Involved in longitudinal inter-tubulin dimer contacts in microtubules
-	sID βαIII (22)	-	Extended vinblastine site; involved in longitudinal inter-tubulin dimer contacts in microtubules; targeted by DARPin 1/2 and RB3
pID αI	_	_	Involved in longitudinal intra tubulin contact; targeted by TTL; equivalent to pID β I
pID αII	_	_	Merges with pID αI
pID αIII	_	_	Novel
pID αIV	sID αII (3)	αΗ1, αΗ2, αΗ2-S3, αΗ7	Novel; communicates with α -ns
pID αV	_	_	Targeted by Alp14; communicates with pID α XII
pID αVI	sID βαIII (22)	αΗ10-αS9, αΗ8, αS9 *	Extension of the vinblastine site; targeted by RB3; equivalent to β IV
pID αVII	- '	-	Involved in lateral inter-tubulin dimer contacts in microtubules; targeted by iiiA5 alphaRep
pID αVIII	_	_	Novel
pID αIX	sID αI (1)	αΗ6, αΜ, αΗ9	Novel; equivalent to pID βVIII
pID αX		_	Novel
pID αXI	_	_	Novel
pID αXII	_	_	Novel; communicates with αV ; equivalent to βV

[a] Identifier of pockets predicted computationally. [b] Identifier of sites identified by the crystallographic fragment screen. The number of fragments targeting a particular site is given in parenthesis. [c] Shared tubulin secondary structural elements between corresponding pockets and sites. Asterisks indicate partial overlap. [d] For additional notes, see Supplementary Table S1, Table S3, Table S4, and Table S5. ns, nucleotide site; Novel, site that has not been described to be targeted by any structurally characterized ligands or protein partners.

affects the interaction of GDP or GTP with the β-nucleotide site. [11] In addition, pocket pID β VIII (p = 57%), which is formed by residues of helix β H6 and the loop β H9- β S8 weakly communicates with pID βX of the laulimalide/peloruside site. Finally, pID β VII and β IX (p = 32% and 31%, respectively), which are formed by residues of helices β H3, β H5, β H12, and helix βH3 and loop βS3-βH3 respectively, do not show any contribution to the pocket communication network.

The overall pocket distribution in α -tubulin is somewhat similar to that detected in β-tubulin. A distinctive pocket is pID α VI (p = 52%) that resembles the entrance of the colchicine site of β-tubulin (equivalent to pocket pID βIV). Interestingly, despite the fact that the α S9- α S10 loop is longer than the corresponding one in β -tubulin, which is part of the taxane site, two pockets, pID αV (p = 51 %) and pID αXII (p=32%), were identified in this region. Close to them and separated by the α M-loop, we found pocket pID α IX (p =30%), which is formed by residues of helices α H6, α H9 and loop α H9- α S8.

Pocket pID α IV (p = 69%), which is formed by residues of helices α H1, α H2, α H7 and loop α H2- α S3, is in a communication pathway that includes also the α -nucleotide site but not pockets pID αV and αXII , which are located close to the α M-loop. In contrast, the equivalent pID α IV pocket in β -





tubulin (pID βVI) connects the βM-loop containing taxane site of β -tubulin with the β -nucleotide site (see above). The pID αIV-mediated communication network that is located close to the intra-dimer interface includes in addition pockets pID αI (equivalent to pID βI and in reach of the βH10-βS9 loop of the β -tubulin monomer), α II and α XI (p = 86%, 77% and 51%, respectively). These additional pockets are often merged together to form a single, larger cavity formed by residues of helices α H5, α H6, and α H11, and loops α H9- α S8 and $\alpha S5-\alpha H5$. The network is interrupted by pockets pID αX (p=30%) and α VIII (p=51%), which are formed by residues of helix $\alpha H1$ and loop $\alpha H1$ - $\alpha H1'$, and helix $\alpha H1$ and loops $\alpha H1-\alpha H1'$ and $\alpha S9-\alpha S10$, respectively. Finally, pocket pID α III (p = 62%), which is shaped by residues of loop α H8- α S7 and helices α H5 and α H11, and pID α VII (p =85%), which is surrounded by helix α H3 and the loops α H1- α S2 and α H2- α S3 appeared to be both isolated and are not involved in any communication network.

Crystallographic Fragment Screening

With the two-fold objective to experimentally validate our computational predictions and to identify potential ligands able to bind into novel pockets in tubulin, we conducted an Xray crystallography-based fragment screen. A fragment is a small, ≈ 200 Da chemical entity that in combination with a crystal structure of the fragment complexed to its target has been recognized as a powerful tool for structure-based drug design.[12] To this end, we used a well-established crystal system composed of two bovine brain αβ-tubulin heterodimers (the monomers are denoted α Tub1, β Tub1, α Tub2, and βTub2), the stathmin-like domain of rat RB3 and chicken tubulin tyrosine ligase (TTL); the complex is denoted T₂R-TTL.[4,13] We soaked individual crystals with 708 different fragments, collected 672 X-ray diffraction data sets, and solved 503 structures with a resolution better than 4.0 Å. In these structures, unambiguous electron densities for 59 unique fragments were identified (resolution range of 1.9-3.1 Å; Table S2 and Figure S2). From these, 15 bound simultaneously to two or more different tubulin sites and 10 bound as pairs two times to the same site. Three fragments were not considered for further analysis, as they were bound to sites involving RB3 residues or crystal contacts.

For their description, we arbitrarily gave the fragment sites an identifier (sID) by numbering them consecutively according to their location in the T_2R -TTL complex, i.e., β -tubulin, β -tubulin- α -tubulin inter-dimer interface (i.e., β Tub1- α Tub2), and α -tubulin. We also use the term "site" in this section to distinguish it from a computationally predicted "pocket" (see above). An overview of the location of the fragment sites in the two $\alpha\beta$ -tubulin heterodimers of T_2R -TTL is given in Figure 2 and selected features of them are collected in Table 1 and Table S3. The chemical structures of the 59 identified fragments and some of their structural particularities that are important for binding are shown in Figure S3 and Figure 3, respectively. In the following, we first describe the sites in β -tubulin, move to the ones located at the β -tubulin- α -tubulin inter-dimer interface and finally to the

ones in α -tubulin. For simplicity, we only explicitly describe interactions of common fragment motifs with tubulin residues

A well-populated site on β-tubulin is sID βIV, which corresponds to the colchicine site. It is targeted by 16 chemically diverse fragments that populate the three zones of the site^[14] and which fill a total volume, V_f , of 780 Å³. They interacted with the protein through either hydrophobic or mixed hydrophobic and polar contacts mediated by residues of helices βH7 and βH8, strands βS1, βS4, βS5, βS6, βS8, βS9, and β S10, and loops β T7 and α T5. In comparison to the apo tubulin structure, [13] all fragments were able to displace loop βT7, an induced structural change that is characteristic of colchicine-site ligands.^[7] Five of them bound twice pairwise to the same site. To our surprise, we found only two fragments in the large taxane site of β -tubulin (sID β II; $V_f = 207 \text{ Å}^3$). This site is formed by residues of helices βH1 and βH7, strands βS7, βS8, and βS10 and loops βM and βS9-βS10. The two fragments share a methylsulfonyl-benzene moiety as a common binding motif. Its sulfonyl group interacted with residues βR320, βS374, and βT376, and its benzene group interacted with $\beta F272$ and is wrapped around by the βM -loop. An additional site on β -tubulin is sID β I ($V_f = 173 \text{ Å}^3$), which is formed by helices βH6 and βH9, and loop βH9-βS8 and is targeted by two fragments. The two fragments share an anilide core as a common binding motif. This core established two hydrogen bonds to βR215 and βT216 whereas the aromatic moiety filled a small hydrophobic cavity that is located between helices βH6 and βH9 and which is formed by βD211, βI212, and βK299. The two varying amide extensions of the fragments were found to be fully solvent exposed. Notably, sID βI is located adjacent to the laulimalide/peloruside site.

An intriguing site on β -tubulin is sID β V, which is targeted by eight fragments ($V_{\rm f} = 669 \, \text{Å}^3$). The site is formed by residues of helices βH4, βH5, βH8, and αH11', strands βS4 and βS5, and loops βH4-βS5, βH5-βS6, and βH8-βS7. Interestingly, it is consistently occupied with a 2-(N-morpholino)ethanesulfonic acid (MES) molecule in various T₂R-TTL crystal structures (e.g., PDB ID 5LXT). In the absence of a ligand, access to this site is occluded due to the formation of a salt bridge between βD199 and βR158, which is broken up upon ligand binding. Five out of the eight fragments that bound to this site established an interaction with βD199 through a nitrogen atom, which is otherwise occupied by the side chain of βR158 or a MES molecule. Besides this nitrogen atom, the fragments are extended by diverse aliphatic or aromatic moieties that interacted differently with the protein. Fragments with aromatic moieties that are connected by an aliphatic linker to the nitrogen atom are able to penetrate into a deep hydrophobic cavity formed by residues βI154, βI157, βY161, βP162, and βM166. Fragments lacking this aromatic extension do not bind this cavity, but interact with residues surrounding its entrance. The last site on β -tubulin is sID β III $(V_f = 179 \text{ Å}^3)$, which is targeted by one fragment and formed by residues of helix β H1', the β N-terminus and loop β T7. This fragment also targeted site sID $\beta\alpha$ II.

A large site located at the β -tubulin- α -tubulin inter-dimer interface of T_2R -TTL is sID $\beta\alpha$ III that corresponds to an





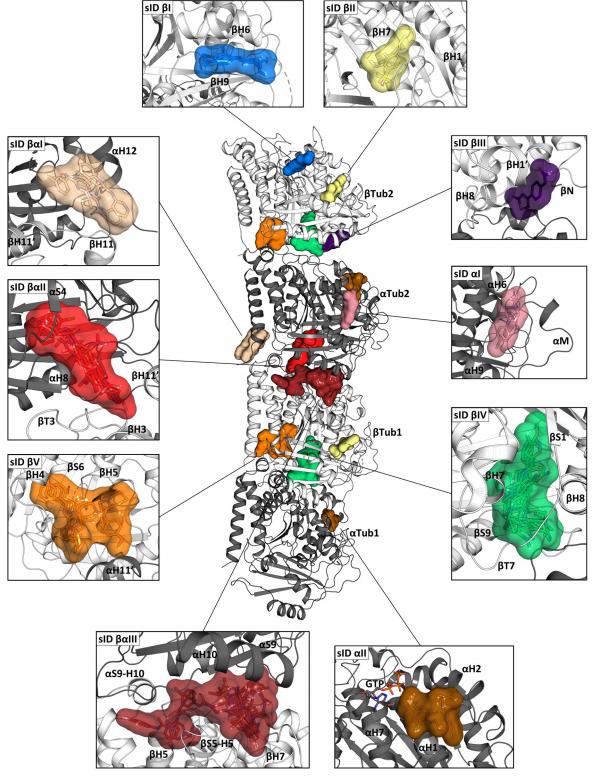
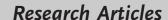


Figure 2. Fragment-binding sites in tubulin determined by X-ray crystallography. In the center of the figure, the structure of the two tubulin heterodimers α Tub1- β Tub1 and α Tub2- β Tub2 are depicted as they are observed in the T₂R-TTL complex. For simplicity, the RB3 and TTL molecules have been omitted. The α - and β -tubulin monomers are shown in dark and light gray ribbon representation, respectively. The surrounding panels show close up views of the revealed fragment sites; the views in the individual panels differ in orientation from the central overview. Only one site is shown in cases where equivalent ones were found in both tubulin dimers. Secondary structural elements defining the sites are labelled. See also Table S3.







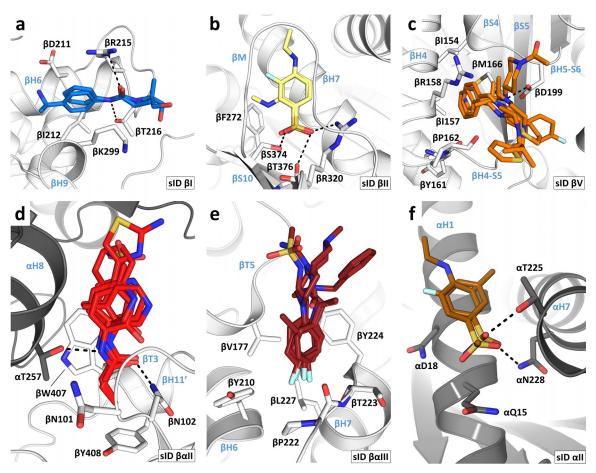


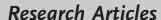
Figure 3. Interaction modes and common binding motifs of fragments. a) Fragments 01 and 53 in sID β I. b) Fragments 02 and 03 in sID β II. c) Fragments 20, 21, 22, 23 and 24 in sID β V. d) Fragments 04, 11 31, 32, 35, 40 and 43 in sID β α II. e) Fragments 22, 44, 45, 49, 51 and 54 in sID β α III. f) Fragments 02 and 25 in sID α II. For all panels, the α - and β -tubulin monomers are depicted in dark and light gray ribbon representation, respectively. Side chains interacting with common fragment binding motifs are shown in stick representation. Secondary structural elements are labeled in blue. Fragments are shown in stick representation using the same color code for their carbon atoms as in Figure 2. Oxygen, nitrogen, sulfur, fluorine and bromine atoms are colored red, blue, yellow, cyan, and brown, respectively. The chemical structures of all 59 fragments identified in this study are shown in Figure S3.

extended vinca site. [15] It is targeted by 22 fragments ($V_{\rm f}$ = 1139 ų) and is formed by residues of helices β H5, β H6, β H7, β H11, α H8, and α H10 and loops β T5, β H6- β H7, α T7, and α H10- α S9. Six of them contain a *para*-substituted fluorobenzene moiety as a common binding motif, which is buried in a small hydrophobic cavity formed by the residues β V177, β Y210, β P222, β T223, β Y224, and β L227. The remaining moieties of these six fragments, as well as the other fragments, differently exploit the large volume of sID $\beta\alpha$ III through hydrophobic or mixed hydrophobic and polar contacts. Notably, ten out of the 22 fragments also bound to an additional site in tubulin and three fragments bound pairwise twice to the same site.

Another interesting site observed at the β -tubulin- α -tubulin inter-dimer interface is sID $\beta\alpha$ II, which is located between the maytansine and pironetin^[16] sites. It is targeted by 16 fragments ($V_{\rm f} = 632~{\rm \AA}^3$) and is formed by residues of helices β H3′, β H11′, and α H8, strand α S4, and loops β T3, β T5, α H3-S4, and α H4- α S5. Five out of the 16 fragments share an acetanilide group and two fragments a propionanilide group

as common binding motif, which bound in a small cavity by forming two hydrogen-bonds to βN102 and αT257, and by establishing a π-stacking interaction with βW407. Furthermore, due to this common π -stacking interaction the varying moieties of these seven fragments are all oriented in the same direction towards the α -tubulin monomer. The remaining eight fragments share little chemical similarities and interacted with tubulin through hydrophobic or mixed hydrophobic and polar contacts. A third site that we observed at the β -tubulin- α -tubulin inter-dimer interface is the shallow surface site sID $\beta\alpha$ I ($V_f = 511 \text{ Å}^3$), which is formed by residues of helix α H12 and loops β H11- β H11' and α H8- α S7. It is targeted by three fragments that mainly bound the protein through hydrogen bonding interactions. Notably, they replaced structural water molecules present in the apo T₂R-TTL structure upon binding. One fragment bound pairwise twice to the same

Compared to β -tubulin that interacted with 56 fragments, only four different fragments were found in α -tubulin, all of which also bound to a second site in the protein. Site sID α II







 $(V_{\rm f}\!=\!364~{\rm \AA}^3)$ is located close to the α -nucleotide site. It is formed by residues of $\alpha{\rm H1},\,\alpha{\rm H2},\,$ and $\alpha{\rm H7}$ and the loop $\alpha{\rm H2}$ - $\alpha{\rm S3}.$ Three fragments targeted sID $\alpha{\rm II},\,$ whereby two of them share a sulfonyl group as a common motif that interacted with residues $\alpha{\rm T225}$ and $\alpha{\rm N228}.$ In addition, a single fragment bound to a site formed by residues of helices $\alpha{\rm H6}$ and $\alpha{\rm H9}$ and the $\alpha{\rm M}$ -loop (sID $\alpha{\rm I},\,V_{\rm f}\!=\!185~{\rm \AA}^3).$ This fragment also targeted site sID $\beta{\rm IV}$ (colchicine site).

It is well known that human cells express different $\alpha\beta$ -tubulin isotypes encoded by several α - and β -tubulin genes (reviewed in ref. [17]). We thus wondered whether the residues that form our identified fragment sites differ between tubulin isotypes. Interestingly and as documented in Table S3, we found at least one isotype-specific residue substitution in all fragment-binding sites.

Comparison between Pockets and Sites

How do the results of our computational- and crystallography-based approaches compare? As documented in Table 1, Table S1 and Table S3, we obtained a good agreement for most of the pockets and sites. In particular: pID $\beta I \rightarrow \beta$ tubulin half-site of sID $\beta\alpha$ III, pID β III and β IV \rightarrow sID β IV, pID β V and β XI \rightarrow sID β II, pID β VIII \rightarrow sID β I, pID α IV \rightarrow sID α II, pID α VI $\rightarrow \beta$ -tubulin half-site of the sID $\beta\alpha$ III, and pID $\alpha IX \rightarrow sID \alpha I$. However, others were revealed only by either of the two methods, which can be explained, for example, by the following reasons: (i) pockets whose access is hindered by the RB3 and TTL bound to the tubulin dimers in the T_2R -TTL complex (pID β VII, α I and α II) are occluded for fragment binding; (ii) pockets that are too small (pID βIX) cannot accommodate the average $\approx 200\,\mathrm{Da}$ size of the fragments tested; (iii) composite sites that are located at the β -tubulin- α -tubulin inter-dimer interface in T_2R -TTL and which involve binding of elements from both tubulin monomers (sIDs $\beta\alpha I$, $\beta\alpha II$, and parts of $\beta\alpha III$) are not considered in our computational strategy; (iv) shallow surface sites (sID βIII) are not detected by our computational algorithm due to the selected probe radii; (v) sites that are induced upon fragment binding (sID βV) and do not persist in the absence of a ligand are not readily detectable in MD simulations.

We observed differences in how the two methods detected known drug-binding sites in tubulin (Table 1, Table S1 and Table S3). For example, our crystallographic fragment screen did not detect the maytansine site pharmacophore^[8] and the laulimalide/peloruside site. This could be due to a possible mismatch in terms of chemical properties, sizes, and shapes between the fragments and these two particular sites. Furthermore, the pironetin site was not detected by both methods, which can be explained by the fact that pironetin binds covalently to α -tubulin by an induced fit mechanism.^[16,18] Nine out of the 12 computationally predicted pockets in α-tubulin were not targeted by any of the fragments, which can be explained, for example, that the chemical space of the fragment library used was limited, that these pockets are not druggable, and/or that the crystallization conditions used prevented fragment binding.

Analysis of Tubulin-Tubulin and Tubulin-Protein Interactions

We wondered whether our combined computational and crystallographic approach also detected structurally characterized interactions between tubulin subunits and between tubulin and protein partners. For this, we use the term "contact point" to distinguish it from a computationally predicted "pocket" or a crystallographically determined "site" (see above). To this end, we first analyzed homotypic interactions between tubulin dimers as they occur in the microtubule lattice. [19] We then inspected heterotypic interactions of tubulin and microtubules with protein partners, whose complex structures were determined to high resolution either by X-ray crystallography or by cryo-electron microscopy (http://www.rcsb.org). The results of our analysis are illustrated in Figure 4, Figure 5 and Figure 6, and summarized in Table 1, Table S4 and Table S5.

A computationally predicted pocket involved in a major lateral inter-tubulin dimer interaction is pID α VII, which represents the contact point accommodating the α M-loop of an adjacent α -tubulin monomer across protofilaments in the microtubule lattice. Pocket pID α I in turn is involved in a longitudinal intra-tubulin dimer contact by accommodating the β H10- β S9 loop of a neighboring β -tubulin monomer along a protofilament. Two fragment sites were identified as contact points mediating major longitudinal inter-tubulin dimer interactions. (i) The α - and β -tubulin half sites of sID $\beta\alpha$ II accommodate helix β H3' and loop β T3, and helix α H8 of neighboring β - and α -tubulin monomers, respectively. (ii) The α - and β -tubulin half sites of sID $\beta\alpha$ III accommodate loop β T5, and helix α H10, strand α S9, and loop α H10- α S9 of neighboring β - and α -tubulin monomers, respectively.

Concerning contact points of tubulin and microtubules with protein partners, we noted that the computationally predicted pockets pID aI and aII are located close to the region that is bound by the tubulin modifying enzyme TTL.[13] In addition, pockets pID αV and αVI are targeted by the TOG domain of the microtubule polymerase Stu2/Alp14^[20] and the N-terminal β-hairpin of the stathmin-like domain of the tubulin sequestering protein RB3, [76] respectively. Two fragment sites, sID βI and βαI interact with the wedge and ridge domain of the spindle assembly factor TPX2, [21] respectively. Site sID βV is targeted by the microtubulebinding domain of the dynein motor heavy chain^[22] and the PN2-3 domain of the centrosomal protein CPAP.[23] We further found that sID $\beta\alpha I$ interacts with the motor domains of *Ustilago maydis* kinesin-5^[24] and kinesin-13, ^[25] two family members of kinesin microtubule depolymerases, as well as with the R1 and R2 repeats of the microtubule-stabilizing protein tau. [26] Finally, the synthetic protein binders iE5 alphaRep^[27] and DARPins 1 and 2^[28] bind to the α-tubulin half site of sID $\beta\alpha I$ and the β -tubulin half site of sID $\beta\alpha III$, respectively, and pocket pID α VII is targeted by the artificial protein binder iiiA5 alphaRep.^[29] The α-tubulin half site of sID $\beta\alpha$ III is in addition also targeted by the stathmin-like domain of RB3.[7b]

We found a few cases where protein partners did not bind to one of the computationally predicted tubulin pockets or crystallographic fragment sites. These are the motor domains



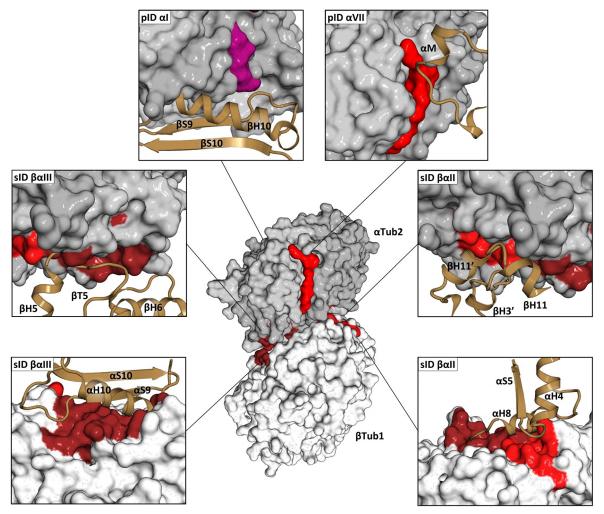


Figure 4. Analysis of tubulin–tubulin contact points. In the center of the Figure, β-tubulin (βTub1, light gray) and α-tubulin (αTub2, dark gray) monomers forming a longitudinal inter-dimer contact along a protofilament in a microtubule (PDB ID 3JAR) are shown in surface representation. The computationally predicted pockets and experimentally determined fragment sites, which are involved in tubulin-tubulin contacts either along or across protofilaments in microtubules are highlighted in the same color as in Figure 1 and Figure 2. The surrounding panels show close up views of all contact points. The interacting secondary structural elements of neighboring tubulin monomers in the microtubule lattice are shown in brown ribbon representation. See also Table S4.

of motile kinesins,^[30] the CH domains of end binding proteins (EBs),^[19,31] the CKK domain of the microtubule minus-end-targeting proteins CAMSAPs,^[32] the spectrin domain of the protein regulator of cytokinesis 1 (PRC1),^[33] the second and third helical motifs of the chlamydial type three secretion effector protein CopN,^[29] the vasohibin-SVBP complex,^[34] and two synthetic protein binders.^[27,29] With the exception of latter, all these interactions are mediated through large shallow, composite binding sites formed either at the intratubulin dimer interface or at inter-tubulin dimer interfaces formed between two or four tubulin dimers in the microtubule lattice. They are thus difficult to be detected by either of our two methods used.

Discussion

Our combined computational and crystallographic fragment screening approach identified a total of 27 distinct binding sites in tubulin. Notably, all major known tubulindrug binding sites were readily detected. Furthermore, several key contact points between tubulin dimers in the microtubule lattice as well as between tubulin dimers and secondary structural elements of regulatory protein partners were revealed. Importantly, our analysis disclosed 18 sites that are not targeted by any of the antitubulin drugs that have been structurally characterized to date. 11 out of those (four in α -tubulin and seven in β -tubulin) are also not targeted by any structurally characterized protein partner and thus represent completely new sites. Our method further revealed an intricate, dynamic communication network between different pockets located also remote from each other in both



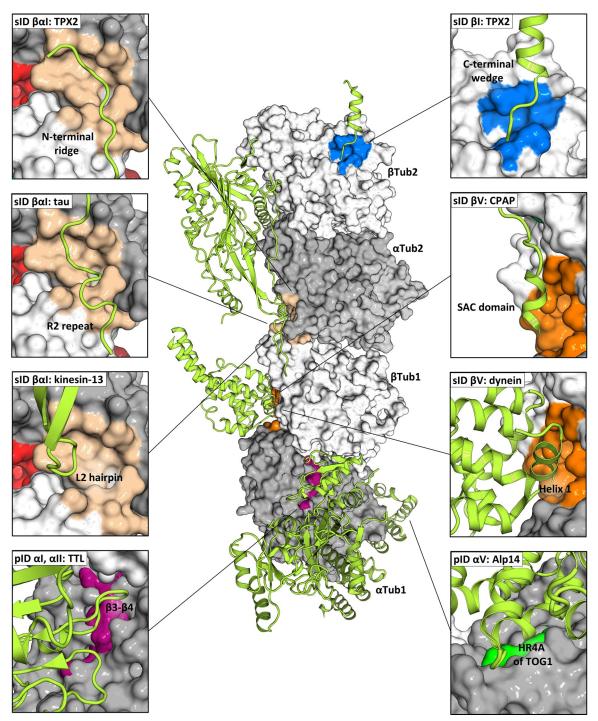


Figure 5. Analysis of tubulin-protein contact points (part 1). In the center of the panel, the structure of the two tubulin heterodimers αTub1- β Tub1 and α Tub2- β Tub2 of the T₂R-TTL complex are depicted in surface representation; the α - and β -tubulin monomers are colored in dark and light gray, respectively. The computationally predicted pockets and experimentally determined fragment sites, which are targeted by protein partners are represented and colored as in Figure 1 and Figure 2. Protein partners are shown in light green ribbon representation. The surrounding panels show close up views of all interaction sites; the views in the individual panels differ in orientation from the central overview. The following PDB IDs were used for the analysis: 5ITZ (CPAP), 6B0I (kinesin-13), 6MZG (Alp14), 5LXT (TTL), 6BJC (TPX2), 6CVN (tau), and 6RZA (dynein). See also Table S5.

tubulin monomers. Finally, we identified 56 chemically diverse fragments that target a total of 10 different sites in tubulin.

It is notable that the vast majority of structurally characterized ligands and protein partners were found to target β -tubulin. The preference for β -tubulin over α -tubulin could be explained by the fact that the GTP hydrolysis cycle takes place on β-tubulin, making this monomer a favorable target for interfering with microtubule dynamics. A question has thus been whether α -tubulin can also be considered as



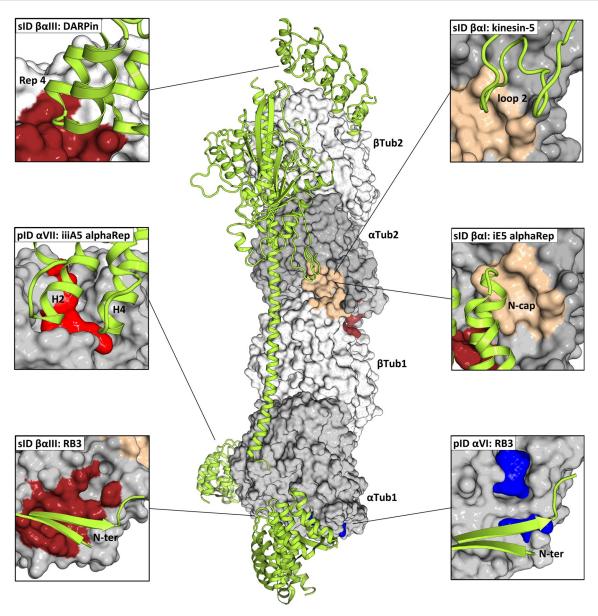


Figure 6. Analysis of tubulin–protein contact points (part 2). In the center of the panel, the structure of the two tubulin heterodimers α Tub1- β Tub1 and α Tub2- β Tub2 of the T₂R-TTL complex are depicted in surface representation; the α - and β -tubulin monomers are colored in dark and light gray, respectively. The computationally predicted pockets and experimentally determined fragment sites, which are targeted by protein partners are represented and colored as in Figure 1 and Figure 2. Protein partners are shown in light green ribbon representation. The surrounding panels show close up views of all interaction sites; the views in the individual panels differ in orientation from the central overview. The following PDB IDs were used for the analysis: 5EYP (DARPin), 5MM7 (kinesin-5), 5LXT (RB3), 6GX7 (iiiA5 alphaREP), and 6GWC (iE5 alphaRep). See also Table S5.

a target for the development of small molecule modulators of microtubule dynamics. Our analysis indeed identified several sites in and fragments able to bind to α -tubulin. It revealed further several fragment sites whose residue composition differ amongst tubulin isotypes, which offers a basis for isotype-selective ligand design. This finding is particularly interesting in the context of chemotherapy since a widely recognized resistance mechanism against anticancer tubulintargeting agents is the upregulation of specific tubulin isotypes by cancer cells. [35] Finally, to the best of our knowledge the so far structurally characterized ligands and proteins that target tubulin do not display any overlapping binding

sites, which is rather surprising. Our crystallographic fragment screen now revealed four sites that are targeted by both fragments and secondary structural elements of major cellular microtubule regulators including tau, dynein, kinesin-13, kinesin-5, TPX2, and CPAP/SAS-4.

In conclusion, our analysis provides a comprehensive description of the shape, chemical property and dynamics of small molecule-binding sites in tubulin. Until now, drug discovery efforts were directed towards interfering with microtubule dynamics. Our results not only offer a platform for the innovative design of more selective antitubulin ligands with novel mechanisms of action, they also provide a struc-

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tural basis for the design of inhibitors of tubulin-protein interactions. In more general terms, our combined computational and experimental approach offers a framework that may help identifying new ligand-binding sites in any other pharmaceutically relevant target and characterize them in terms of chemical tractability and allosteric modulation.

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Conflict of interest

The authors declare no conflict of interest.

Keywords: crystallographic fragment screening · microtubules · molecular dynamics simulation · protein-ligand interactions · tubulin

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