Taxodione and arenarone inhibit farnesyl diphosphate synthase by binding to the isopentenyl diphosphate site

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We used in silico methods to screen a library of 1,013 compounds for possible binding to the allosteric site in farnesyl diphosphate synthase (FPPS). Two of the 50 predicted hits had activity against either human FPPS (HsFPPS) or Trypanosoma brucei FPPS (TbFPPS), the most active being the quinone methide celastrol (IC₅₀ versus TbFPPS $\sim 20 \mu$ M). Two rounds of similarity searching and activity testing then resulted in three leads that were active against HsFPPS with IC₅₀ values in the range of \sim 1–3 μ M (as compared with \sim 0.5 μ M for the bisphosphonate inhibitor, zoledronate). The three leads were the quinone methides taxodone and taxodione and the quinone arenarone, compounds with known antibacterial and/or antitumor activity. We then obtained X-ray crystal structures of HsFPPS with taxodione+zoledronate, arenarone+zoledronate, and taxodione alone. In the zoledronate-containing structures, taxodione and arenarone bound solely to the homoallylic (isopentenyl diphosphate, IPP) site, not to the allosteric site, whereas zoledronate bound via Ma²⁺ to the same site as seen in other bisphosphonate-containing structures. In the taxodione-alone structure, one taxodione bound to the same site as seen in the taxodione+zoledronate structure, but the second located to a more surface-exposed site. In differential scanning calorimetry experiments, taxodione and arenarone broadened the native-to-unfolded thermal transition (T_m), guite different to the large increases in ΔT_m seen with biphosphonate inhibitors. The results identify new classes of FPPS inhibitors, diterpenoids and sesquiterpenoids, that bind to the IPP site and may be of interest as anticancer and antiinfective drug leads.

prenyl synthase | crystallography | prenylation | molecular dynamics | drug discovery

arnesyl diphosphate synthase (FPPS) catalyzes the conden-sation of isopentenyl diphosphete (TPP) sation of isopentenyl diphosphate (IPP; compound 1 in Fig. 1) with dimethylallyl diphosphate (DMAPP; compound 2 in Fig. 1) to form the C₁₀ isoprenoid geranyl diphosphate (GPP; compound 3 in Fig. 1), which then condenses with a second IPP to form the C_{15} isoprenoid, farnesyl diphosphate (FPP; compound 4 in Fig. 1). FPP then is used in a wide range of reactions including the formation of geranylgeranyl diphosphate (GGPP) (1), squalene (involved in cholesterol and ergosterol biosynthesis), dehydrosqualene (used in formation of the Staphylococcus aureus virulence factor staphyloxanthin) (2), undecaprenyl diphosphate (used in bacterial cell wall biosynthesis), and quinone and in heme a/o biosynthesis. FPP and GGPP also are used in protein (e.g., Ras, Rho, Rac) prenylation, and FPPS is an important target for the bisphosphonate class of drugs (used to treat bone resorption diseases) such as zoledronate (compound 5 in Fig. 1) (3). Bisphosphonates targeting FPPS have activity as antiparasitics (4), act as immunomodulators (activating yo T cells containing the Vy2Vo2 T-cell receptor) (5), and switch macrophages from an M2 (tumorpromoting) to an M1 (tumor-killing) phenotype (6). They also kill tumor cells (7) and inhibit angiogenesis (8). However, the bisphosphonates in clinical use (zoledronate, alendronate, risedronate, ibandronate, etidronate, and clodronate) are very hydrophilic and bind avidly to bone mineral (9). Therefore, there is interest in developing less hydrophilic species (10) that might have better activity against tumors in soft tissues and better antibacterial (11) and antiparasitic activity.

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The structure of FPPS (from chickens) was first reported by Tarshis et al. (12) and revealed a highly α -helical fold. The structures of bacterial and Homo sapiens FPPS (HsFPPS) are very similar; HsFPPS structure (13, 14) is shown in Fig. 2A. There are two substrate-binding sites, called here "S1" and "S2." S1 is the allylic (DMAPP, GPP) binding site to which bisphosphonates such as zoledronate bind via a $[Mg^{2+}]_3$ cluster (15) (Fig. 2B). S2 is the homoallylic site to which IPP binds, Fig. 2B. Recently, Jahnke et al. (10) and Salcius et al. (16) discovered a third ligand-binding site called the "allosteric site" (hereafter the "A site"). A representative zoledronate+A-site inhibitor structure [Protein Data Bank (PDB) ID code 3N46] (Nov_980; compound 6 in Fig. 1) showing zoledronate in S1 and Nov 980 (compound 6) in the A site is shown in a stereo close-up view in Fig. 2B, superimposed on a zoledronate+IPP structure (PDB ID code 2F8Z) in S2. Whether the allosteric site serves a biological function (e.g., in feedback regulation) has not been reported. Nevertheless, highly potent inhibitors (IC₅₀ \sim 80 nM) have been developed (10), and the best of these newly developed inhibitors are far more hydrophobic than are typical bisphosphonates

Significance

There is an ever-present need for new drugs because of drug resistance. An enzyme called "farnesyl diphosphate synthase" (FPPS) is one important drug target, and drugs called "bisphosphonates" that inhibit this enzyme are of interest both as cancer therapeutics and as antibacterial and antiparasitic drug leads. However, they bind avidly to bone and so are ineffective against most tumors and most infectious organisms. Here, we report the discovery of compounds that lack a bone-binding feature that target FPPS in a unique way, as observed at the atomic level. They also can bind to other protein targets, providing a potentially important approach, multitarget inhibition, that is expected to increase efficacy and decrease the likelihood that resistance will develop.

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Data deposition: The atomic coordinates and structure factors have been deposited in the RCSB Protein Data Bank, www.pdb.org [PDB ID codes for FPPS complexed with: taxodione/ zoledronate (4P0V), arenarone/zoledronate (4P0W), and taxodione (4P0X)].

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Fig. 1. Chemical structures of FPPS substrates, products, and inhibitors.

(\sim 2.4–3.3 for cLogP vs. \sim –3.3 for zoledronate) and are expected to have better direct antitumor effects in soft tissues (10).

In our group we also have developed more lipophilic compounds (e.g., compound 7 in Fig. 1) (17, 18) as antiparasitic (19) and anticancer drug leads (18) and, using computational methods, have discovered other novel nonbisphosphonate FPPS inhibitors (e.g., compound 8 in Fig. 1) that have micromolar activity against FPPS (20). In this study, we extended our computational work and tried to discover other FPPS inhibitors that target the A site. Such compounds would be of interest because they might potentiate the effects of zoledronate and other bisphosphonates, as reported for other FPPS inhibitors (21), and have better tissue distribution properties in general.

Results

Discovery of FPPS Inhibitors. We sought to find FPPS inhibitors by using virtual screening with both X-ray structures and structures obtained from molecular dynamics (MD) simulations. We first carried out an MD simulation of HsFPPS based on the crystal structure of the allosteric site inhibitor Nov 823 (PDB ID code 3N6K), with and without the inhibitor. Full details are given in Methods and Materials. The structural ensemble chosen for the virtual screening was representative of both snapshots from the MD simulation and the allosteric site FPPS crystal structures that previously were demonstrated to be valuable in virtual screening (20): PDB ID codes 3N1V, 3N1W, 3N3L, 3N5H, 3N5J, 3N6K, 3N45, 3N46, and 3N49. Structures representing the conformational variability of the allosteric site during the simulations were extracted using clustering in which frames taken every 10 ps were extracted from the MD trajectories. These frames were aligned using all C_{α} atoms that were within 10 Å of the ligand in the ligand-bound starting structure. Subsequent clustering was performed by rmsd using conformational clustering (22) resulting in five apo and four ligand-bound clusters that represented at least 90% of the trajectories. The total structural ensemble for the virtual screens thus consisted of 18 FPPS structures: nine from the MD simulations, and nine X-ray structures.

Virtual screening was performed using the National Cancer Institute (NCI) diversity set III, a subset of the full NCI compound database. Ligands were prepared using LigPrep (23), adding missing hydrogen atoms and generating all possible ionization states as well as tautomers. The final set used for virtual screening contained 1,013 compounds. Docking simulations were performed with both AutoDock Vina (24) and Glide (25– 27). The individual AutoDock Vina and Glide rankings were combined to form a consensus list of compounds that scored well with both methods. The seven top-scoring compounds from AutoDock Vina and Glide, respectively, and the top 36 compounds from the consensus list were chosen as the final 50 compounds for experimental investigation (*SI Appendix*, Fig. S1).

We obtained these 50 compounds from the Drug Synthesis and Chemistry Branch, Developmental Therapeutics Program, Division of Cancer Treatment and Diagnosis, National Cancer Institute (NCI/DTP) and tested them for inhibition of HsFPPS and TbFPPS, the latter being of interest because it is an antiparasitic drug target (28). In an initial screen we tested compounds for FPPS inhibition (29) at an inhibitor concentration of 25 μ M. Compounds that showed any inhibition then were retested,



Fig. 2. Structures of human FPPS. (A) Structure of HsFPPS showing zoledronate (compound 5) and IPP (compound 1) bound to the S1 (allylic) and S2 (homoallylic) ligand-binding sites (PDB ID code 2F8Z). (B) Superposition of the IPP-zoledronate structure (PDB ID code 2F8Z) on the zoledronate-Nov_980 A-site inhibitor structure (PDB ID code 3N46). Zoledronate binds to the allylic site S1, IPP binds to the homoallylic site S2, and the allosteric site inhibitor binds to the A site. Active-site "DDXXD" residues are indicated, as are Mg²⁺ molecules (green and yellow spheres, respectively). The views are in stereo.

and a full dose-response curve was obtained. There were two hits: celastrol (compound 9 in Fig. 1) and NSC9037, 2,6,7-trihydroxy-9-(2-hydroxyphenyl)xanthen-3-one (compound 10 in Fig. 1). These compounds had the following IC₅₀ values in FPPS inhibition: compound 9:, TbFPPS, 17 µM and HsFPPS, no activity; compound 10: TbFPPS, 54 µM; HsFPPS, 81 µM (SI Appendix, Table S1). Both compounds are guinone methides, and compound 9 has diverse biological activities (30-33). Therefore we elected to use compound 9 as the basis for a similarity search using the NCI/ DTP option in PubChem (https://pubchem.ncbi.nlm.nih.gov/) with compounds again being obtained from the NCI/DTP (http://dtp. cancer.gov). Twenty-five compounds (SI Appendix, Fig. S2) were tested against both HsFPPS and TbFPPS. The only compound with activity was NSC122419, the quinone methide taxodione (compound 11 in Fig. 1), which had an IC₅₀ of 1.2 μ M against HsFPPS (SI Appendix, Table S1); in comparison, zoledronate had an IC₅₀ of 0.5 µM under the same assay conditions.

We then carried out a second similarity search based on taxodione (compound 11) and tested 15 compounds (*SI Appendix*, Fig. S3) from the NCI/DTP against HsFPPS. There were two hits with IC₅₀ in the 1–3 μ M range: the quinone methide taxodone (compound 12 in Fig. 1) and the quinone arenarone (compound 13 in Fig. 1), both of which have been reported to have antiinfective or anticancer activity (34–39). All three terpenoid inhibitors (compounds 11, 12, and 13) thus contain either the hydroxyquinone methide fragment found in the terpenoid celastrol (compound 9) and compound 10 or a quinone moiety (compound 13); all three compounds (11, 12, and 13) are quite active against FPPS (*SI Appendix*, Table S1) and have been reported to be active against tumor cells (35, 40, 41). We also tested compounds 9, 11, and 13 against the MCF-7 tumor cell line and found IC₅₀ values for cell growth inhibition (*SI Appendix*, Table S1) of 0.2, 2, and 17 μ M, respectively. Compounds 11, 12, 13 are all slightly more hydrophobic than the A-site inhibitors (10) with cLogP ~4 for taxodione and taxodone, and cLogP ~5 for arenarone, vs. ~3.3 for the most potent A-site inhibitor (10). To see if there was any activity against geranylgeranyl diphosphate synthase (GGPPS), another potential drug target, we tested all hits against an expressed human GGPPS (HsGGPPS). There was much less activity than with FPPS (compound 9, 32 μ M; compound 10, > 200 μ M; compound 11, 20 μ M; compound 12, 46 μ M; compound 13, 21 μ M; *SI Appendix*, Table S1).

X-Ray Crystallographic Investigations. We next sought to investigate how compounds **11**, **12**, and **13** bind to HsFPPS. We were unsuccessful in obtaining crystals containing compound **12** (taxodone), but we did obtain three other crystal structures: taxodione+zoledronate (PDB ID code 4P0V); arenarone+zoledronate (PDB ID code 4P0W), and taxodione alone (PDB ID code 4P0X) in which there were two bound taxodione molecules. Crystals diffracted to 2.4 Å (compound **11**+zoledronate), 2.4 Å (compound **13**+zoledronate), and 2.5 Å (compound **11** alone). Full data acquisition and refinement details are given in Table 1, and experimental details are given in *Materials and Methods*. Ligand electron densities are shown in *SI Appendix*, Figs. S5–S7.

| Table 1 | Data | collection | and | refinement | statistics |
|----------|--------|------------|-----|------------|------------|
| I able I | . Data | conection | anu | rennement | statistics |

| Crystal (PDB ID code) | HsFPPS- 5/11 (4P0V) | HsFPPS-5/13 (4P0W) | HsFPPS- 11/11(4P0X) | | |
|--|----------------------------|--------------------|-----------------------------|--|--|
| Data collection | | | | | |
| Radiation source | LS-CAT 21-ID-F | LS-CAT 21-ID-F | LS-CAT 21-ID-F | | |
| Wavelength, Å | 0.97857 | 0.97857 | 0.97857 | | |
| Space group | P41212 | P41212 | P41212 | | |
| a, Å | 112.14 | 111.24 | 110.62 | | |
| b, Å | 112.14 | 111.24 | 110.62 | | |
| c, Å | 67.05 | 67.29 | 78.44 | | |
| Resolution, Å* | 50.0-2.40 | 50.0-2.40 | 50.0-2.30 | | |
| | (2.44–2.40) | (2.44–2.40) | (2.34–2.30) | | |
| No. of reflections | 17,015 (828) | 16,815 (820) | 22,231 (1,103) | | |
| Completeness, % | 98.5 (100.0) | 99.7 (100.0) | 99.8 (100.0) | | |
| Redundancy | 8.1 (7.7) | 26.0 (26.5) | 11.0 (11.1) | | |
| R _{merge} , % | 8.1 (57.8) | 10.9 (32.6) | 7.7 (64.5) | | |
| l/s(l) | 35.8 (4.4) | 76.5 (16.5) | 44.0 (4.6) | | |
| Refinement | | | | | |
| Resolution, Å* | 50.0-2.40 | 50.0-2.40 | 50.0-2.50 | | |
| | (2.46–2.40) | (2.46–2.40) | (2.57–2.50) | | |
| No. of reflections | 16,076 (1175) | 15,618 (835) | 16,446 (880) | | |
| R _{work} , % | 20.6 (23.6) | 20.4 (26.0) | 20.7 (26.4) | | |
| R _{free} , % | 29.2 (33.0) | 28.9 (33.9) | 27.9 (32.9) | | |
| Geometry deviations | | | | | |
| Bond lengths, Å | 0.014 | 0.017 | 0.016 | | |
| Bond angles, ° | 1.575 | 1.791 | 1.760 | | |
| Mean B-values. Å ² /no. non-H | l atoms | | | | |
| All refined atoms | 57.5/2,880 | 50.9/2,904 | 50.5/2,764 | | |
| Compound atoms | 55.2/39 | 40.8/39 | 60.4/46 | | |
| Mg ions | 42.7/3 | 27.1/3 | | | |
| Water molecules | 49.8/32 | 41.1/56 | 42.7/61 | | |
| Ramachandran plot, % | | | | | |
| Most favored | 91.7 | 93.3 | 92.8 | | |
| Additionally allowed | 8.3 | 6.7 | 7.2 | | |
| Generously allowed | 0 | 0 | 0 | | |
| Disallowed | 0 | 0 | 0 | | |

*Values in parentheses are for the highest-resolution shells.

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Fig. 3. Structures of taxodione (compound 11)+zoledronate+Mg²⁺ (compound 5) bound to HsFPPS (PDB ID code 4P0V). (A) Stereo view of the taxodione+zoledronate+Mg²⁺ structure. (B) Close-up view of bound ligands. (C) Superposition of the taxodione+zoledronate+Mg²⁺ structure with the zoledronate+Nov_980+Mg²⁺ structure (PDB ID code 3N46). (D) Superposition of the taxodione+zoledronate structure with zoledronate+IPP structure (PDB ID code 2F8Z). Taxodione binds to the IPP site, S2. The views are in stereo.

Taxodione (compound 11) crystallized together with one molecule of zoledronate (compound 5) and three Mg^{2+} ; stereo views of the structure (PBD ID code 4P0V) are shown in Fig. 3 *A* and *B*. Zoledronate binds, as expected, to the S1 site via three Mg^{2+} and there is a 0.3-Å rmsd between all zoledronate atoms and Mg^{2+} in the taxodione+zoledronate+ Mg^{2+} structure vs. the zoledronate+IPP+ Mg^{2+} alone structure (PDB ID code 2F8Z). However, the taxodione ligand does not bind to the A site found with the Novartis inhibitor compound 6 (PDB ID code 3N46) (shown superimposed on the taxodione+zoledronate+ Mg^{2+} structure in Fig. 3*C*). It is particularly interesting that the quinone methide fragment in this taxodione+zoledronate structure occupies the IPP diphosphate-binding site (Fig. 3D). No other FPPS inhibitors (except for *S-thiolo-IPP*) bind to this S2 site.

As noted above, there are two ligand-binding sites in FPPS. The S1 site contains primarily the two DDXXD motifs involved in binding to the three Mg^{2+} and the allylic substrate, DMAPP, with Mg²⁺ facilitating diphosphate ionization. In Table 2 we show the results of a SCORECONS analysis (42), which ranks residues in terms of their essential nature: A score of 1.000 means the residue is essential; a residue with a score of 0 is nonessential. The top 20 residues (minus structural G and P residues) are shown in Table 2 together with their ligand interactions. As can be seen in Table 2, in addition to the catalytic Asps, numerous highly conserved Arg/Lys residues, including K57, R60, R112 and R113, K57, R60, and R113, are involved in electrostatic/hydrogen bond interactions with the IPP ligand in S2 (Fig. 4A). Notably, R60 and R113 also are the ligands that are very close to the taxodione carbonyl and OH groups (Fig. 4B); a LigPlot (43) view of these interactions is shown in *SI Appendix*, Fig. S5.

We next obtained the structure of taxodione (compound 11) alone bound to HsFPPS (PDB ID code 4P0X). Full data acquisition and structure refinement details are given in Table 1, and experimental details are given in Materials and Methods. Electron densities are given in *SI Appendix*, Fig. S4*B*. Crystallization was carried out in the presence of Mg^{2+} and GPP, but only taxodione was present in the crystals. Full and expanded stereoview structures are shown in Fig. 5 A and B, and Fig. 5C shows the superposition of the taxodione (cvan ligands)+zoledronate structure (PDB ID code 4P0V) and the taxodione-only (magenta and orange ligands) structure (PDB ID code 4P0X). All proteinligand interactions are shown in SI Appendix, Fig. S6. SI Appendix, Figs. S5 and S6 show that one taxodione molecule (orange in Fig. 5B and SI Appendix, Fig. S6B) is located near the protein surface, and the second taxodione molecule (magenta), is bound to the IPP site and interacts with N59 and with the water molecules, R60, E93, Q96, and Q240.

Finally, we determined the structure of the arenarone+zoledronate+ Mg^{2+} complex (PDB ID code 4P0W). Full data acquisition and structure refinement details are given in Table 1, and ex-

Table 2. Top SCORECONS scores of HsFPPS

| Rank | Residue no. | Amino acid | SCORECONS | Interacting ligands |
|------|----------------|---------------|-----------|---|
| 1 | 240 | Q | 0.912 | 1, 2 |
| 2 | 244 | D | 0.900 | Mg ²⁺ |
| 3 | 112 | R | 0.871 | 2, 5, 11, 13 |
| 4 | 243 | D | 0.840 | Mg ²⁺ , 1 , 5 , 11 |
| 5 | 113 | R | 0.835 | 1, 11, 13 |
| 6 | 104 | D | 0.833 | Mg ²⁺ |
| 7 | 103 | D | 0.831 | Mg ²⁺ , 5 |
| 8 | 100 | L | 0.828 | 5, 11, 13 |
| 9 | 261 | D | 0.826 | Mg ²⁺ |
| 10 | 200 | К | 0.823 | 2, 5 |
| 11 | 60 | R | 0.819 | 1, 11, 13 |
| 12 | 57 | К | 0.811 | 1, 11, 13 |
| 13 | 239 | F | 0.809 | 1, 11, 13 |
| 14 | 96 | Q | 0.807 | 1, 11, 13 |
| 15 | 201 | Т | 0.804 | 1, 2, 5 |
| 16 | 353 | К | 0.797 | 1, 11 |
| 17 | 93 | E | 0.795 | 1, 11, 13 |
| 18 | 107 | D | 0.788 | Mg ²⁺ , 5 |
| 19 | 351 | R | 0.783 | 1 |
| 20 | 257 | К | 0.780 | 1, 5, 11 |



Fig. 4. Protein–ligand interactions in the IPP-binding site. (*A*) IPP (PDB ID code 2F8Z). (*B*) Taxodione from the taxodione+zoledronate structure (PDB ID code 4P0V). (*C*) Arenarone (PDB ID code 4P0W). The views are in stereo.

perimental details are given in *Materials and Methods*. Electron densities are shown in *SI Appendix*, Fig. S4C. Ligand–protein interactions are shown in *SI Appendix*, Fig. S7. The structure (Fig. 6 A and B) is quite similar to that seen in the taxodione+zoledronate+ Mg²⁺ complex, with arenarone again occupying the IPP site, S2 (Fig. 6C), and Arg60 again being in close proximity to one ligand, carbonyl oxygen (Fig. 4C and *SI Appendix*, Fig. S7). Superposition of the taxodione+zoledronate+Mg²⁺, arenarone+zoledronate+Mg²⁺, and 6+zoledronate+Mg²⁺ structures in Fig. 6D again shows that taxodione and arenarone do not bind to the allosteric site A; presumably, the initial hit (celastrol) was detected because the pocket used in the in silico screen extends into the IPP pocket.

A Principal Component Analysis of FPPS Structures. The results described above are of interest because they show an unusual FPPS inhibitor binding mode, so we next investigated how these protein structures compared with previously reported HsFPPS structures. We first used the POVME program (44) to measure pocket volumes (for apo and deliganded structures). The results in *SI Appendix*, Table S2 clearly show that the open and closed pockets are quite distinct. The pockets found in apo, taxodione-only, and the Novartis allosteric site-only inhibitors are open and

have volumes of 858 ± 24 Å³, whereas the closed pockets have volumes of 508 ± 50 Å³ (*SI Appendix*, Table S2). In each case the closed pocket structures contain one bisphosphonate.

We then used principal component analysis (PCA) to analyze all these HsFPPS structures. PCA mathematically converts a number of possibly correlated multivariables into sets of linearly uncorrelated variables through orthogonal transformation, thereby reducing the dimensionality, or the number of variables, of the dataset. The first PC describes the largest variance in the dataset, allowing the data to spread most along PC 1. Each successive PC describes the next largest variance orthogonal to the previous PCs. We used PCA because in other work [on undecaprenyl diphosphate synthase (UPPS)] we found we could separate UPPS structures into open, closed, and semiopen states based on a 2D method, that is, using two principal components (PCs), whereas a 1D volume-only-based method did not permit such clustering. We sought to go beyond the volume-only descriptions of the structures.

The 39 structures (the three reported here plus 36 others) formed only two clusters: the open conformations noted above that were centered around PC1 = -30 Å, PC2 = 0 Å and the closed conformations noted above that were centered around PC1 = 10 Å, PC2 = 0 Å (Fig. 7A). All the structures in the open



Fig. 5. Structure of taxodione bound to HsFPPS in the absence and presence of zoledronate. (A) Full structure (PDB ID code 4POX) showing two taxodione ligands. (*B*) Expanded view of *A* showing the buried (magenta) and more solvent exposed (orange) taxodione ligands. (*C*) Superposition of the taxodione (PDB ID code 4POX) (*Left*) and taxodione+zoledronate structures (PDB ID code 4POV) (*Right*) showing similar locations of the buried taxodiones. The views are in stereo.



Fig. 6. Structure of arenarone+zoledronate bound to HsFPPS (PDB ID code 4POW) and a comparison with the structures of taxodione+zoledronate (PDB ID code 4POV) and Nov_980+zoledronate (PDB ID code 3N46). (A) Arenarone+zoledronate (PDB ID code 4POW) and IPP+zoledronate (PDB ID code 4POW) and IPP+zoledronate (PDB ID code 2F8Z) structures showing S2 binding of arenarone. (D) Superposition of the taxodione+zoledronate (PDB ID code 4POV), arenarone+zoledronate (PDB ID code 3N46) structures. The three zoledronate-binding poses are all very similar, whereas both taxodione and arenarone bind to S2, the IPP site, not to the A site. The views are in stereo.

form shown in Fig. 7*A* (2F7M, 2N1V, 3N1W, 3N3L, 3N49, 3N5H, 3N5J, 3N6K, 1FPS, and 4P0X) are either apo, allosteric site inhibitor (alone), or taxodione-alone liganded structures, whereas all the closed structures (4GA3, 3RYE, 3S4J, 4DEM, 4H5D, 4H5E, 4H5C, 4JVJ, 4L2X, 2RAH, 2VF6, 1YQ7, 1YV5, 2OPN, 2OPM, 3B7L, 2F89, 2F8C, 2F8Z, 2F92, 2F94, 2F9K, 3N45, 3N46, 1ZW5, 2QIS, 4P0V, and 4P0W) contain a bisphosphonate and Mg²⁺ (in some cases in addition to another ligand,

such as taxodione, IPP, or one of the allosteric site inhibitors plus zoledronate). The two types of cluster or structure apparently originate from bisphosphonate binding via Mg^{2+} to the DDXXD motifs (Fig. 2*B*) and, as proposed previously (10), arise from the movement of the C terminus starting around residue 230, which here correlates with a major change in PC1 (Fig. 7*B*).

These results raise the question as to which states are sampled in the two MD simulations used in the virtual screening. Results for the apo-FPPS simulation projected onto PC space are shown in Fig. 7*C*, and results for the liganded form (Nov_823/PDB ID code 3N6K) are shown in Fig. 7*D*. Both simulations start in the open state. However, as shown in Fig. 7*C*, the apo form simulation samples, primarily, partially closed conformations with a PC1 ~-8Å, whereas the ligand-bound simulation exhibits two distinct conformational distributions: an open conformation (PC1 ~-25Å) and a partially closed conformation (PC1 ~-3Å), indicating that the ligand prevents pocket closing and thus perhaps providing a basis for the designation "allosteric."

Differential Scanning Calorimetry. These PCA and pocket volume observations raise the interesting question: Do taxodione and arenarone alone increase the folded to unfolded transition temperatures (T_m), in differential scanning calorimetry experiments? As shown by Rondeau et al. (13), the addition of bisphosphonates to FPPS in the presence of Mg²⁺ increases T_m by up to 25 °C (in the case of zoledronate). Bisphosphonates with weaker inhibitory potency result in smaller T_m shifts, but the addition of IPP to each bisphosphonate raises T_m, with the effects being largest with the weakest inhibitors. Inhibitors generally increase T_m values in proteins, but decreases in T_m also are possible on ligand binding, e.g., as found with ATP binding to the glucose transporter GLUT-1 (Δ T_m ~-12 °C) (45), or cyclodextrins binding to lysozyme (Δ T_m ~-10 °C) (46).

In Fig. 8 we show differential scanning calorimetry (DSC) results for HsFPPS (+Mg²⁺) alone or in the presence of zoledronate at a ligand:protein molar ratio of 10:1 ($\Delta T_m \sim 25$ °C), as well as in the presence of 1, 2, and 10 taxodione molecules per protein, arenarone at a ligand:protein molar ratio of 10:1, and taxodione+zoledronate at a ligand:protein molar ratio of 10:1.



Fig. 7. PCA of HsFPPS structures; units are in Ångstroms. (A) Thirty-nine HsFPPS structures showing clustering into open and closed groups (in PC space). (B) Structural representation of variation along PC1. (C) PCA obtained by using an apo-FPPS trajectory (PDB ID code 3N6K, minus the ligand) showing the dominance of partially closed structures. (D) PCA using the liganded structure (PDB ID code 3N6K) for MD showing many more open structures.

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Fig. 8. Differential scanning calorimetry of HsFPPS + 5 mM Mg²⁺ in the presence or absence of zoledronate (Zol) (compound 5), taxodione (Taxo) (compound 11) or arenarone (Aren) (compound 13) at the ligand:protein molar ratios indicated. Zoledronate causes a large (~25 °C) increase in T_m, the maximum in the thermogram of the native-to-unfolded transition. The terpenoid inhibitors broaden the transition.

As can be seen in Fig. 8, there is no increase in T_m with either taxodione or arenarone. Rather, with taxodione the endotherm broadens at molar ratios of 1:1 and 2:1 and is not detectable at a taxodione: FPPS molar ratio of 10:1. Likewise, no endotherm is detected in the presence of arenarone at a ligand: FPPS molar ratio of 10:1. These results are consistent with the observation that, unlike the situation with bisphosphonate/Mg²⁺ binding, the FPPS/taxodione structure more closely resembles the apo structure in terms of PC1 clustering and pocket volume and thus has an unfolding transition that is similar in terms of T_m to that seen with the ligand-free protein. However, the observation that the transition is not visible at higher ligand concentrations was unexpected and perhaps suggests that multiple taxodione molecules may bind to the unfolded protein; this observation, although perhaps somewhat speculative, would be consistent with the presence of two ligand-bound populations in the zoledronate+ taxodione system (Fig. 8D).

Structure of the Taxodione/N-Acetyl Cysteine Adduct. The first hit we obtained from the in silico screen was the quinone methide celastrol (compound 9). This compound, extracted from Thunder of God vines, is a component of traditional Chinese medicines and has been of interest in the context of the development of therapeutics to treat a wide range of diseases (30-32, 47). Early work suggested inhibition of Hsp90•Cdc37 (48), but more recently several other targets, including annexin II and β-tubulin, have been reported (49). This guinone methide is reported to react with proteins via Michael addition (49, 50) of cysteine thiol groups to form the adduct compound 14 (Fig. 9). Like celastrol (compound 9), taxodione is a quinone methide that reacts with protein cysteine thiol groups, as was noted as early as 1970 with phosphofructokinase (51). In addition, as does celastrol, taxodione is reported to have diverse biological activities (35, 38, 52). This chemical reactivity, if combined with FPPS inhibition, might lead to potent multitarget inhibitors, perhaps including more tumor-specific (e.g., ras-bearing) targets.

To investigate how thiols might bond to taxodione, we used NMR and mass spectrometry. The high-resolution mass spectrum of a 1:1 taxodione:N-acetyl cysteine mixture indicated the formation of a 1:1 adduct, SI Appendix, Fig. S84. However, as shown in Fig. 9A, there are four possible taxodione sites at which cysteine thiols might bind, leading to compounds 15-18, and certainly there are many possible stereoisomers. Nucleophilic attack at C2, C4, or C6 in celastrol has been proposed to be possible (50); with taxodione, an additional binding site would be to the second carbonyl group (to form compound 18). A ^{1}H NMR spectrum of the product is shown in SI Appendix, Fig. S8B and indicates only a single aromatic proton (Fig. 9B shows the downfield region), consistent with formation of the Michael adduct compound 17. The gradient-selected COSY spectrum (SI Appendix, Fig. S8D) confirms this structure. The NOESY spectrum (SI Appendix, Fig. S8C) exhibits the NOE correlations shown in Fig. 9C and indicates regiospecific, stereoselective addition leading to the product shown in Fig. 9D [basically the behavior reported in ref. 50 with celastrol, which binds several nucleophiles at the same site (48, 50)].

However, the inhibition effects we see with HsFPPS are not the result of covalent enzyme modification. If we use 100- μ M enzyme concentrations (100× that in the inhibition assays) as well as 100- μ M inhibitor concentrations, we can see (via electrospray-ionization mass spectrometry; *SI Appendix*, Fig. S9 *A* and *B*) that approximately one in three FPPS has one bound taxodione, but this reaction would be ~10,000 times slower in the enzyme inhibition assays in which the both enzyme and inhibitor concentrations are ~1 μ M. The same effect is seen with celastrol/ FPPS: About one in two FPPS is modified (*SI Appendix*, Fig. S9*C*), but here celastrol is not even an inhibitor of HsFPPS.

Conclusions

The results presented above are of interest for several reasons. First, we used in silico screening to discover inhibitors of farnesyl diphosphate synthase. Using MD-based methods followed by in silico and in vitro screening, we found that the triterpenoid celastrol, a quinone methide, inhibited Trypanosoma brucei FPPS (TbFPPS) with an IC₅₀ \sim 20 μ M. We then carried out two rounds of similarity searching leading to three leads having IC50 values in the 1-3 µM range against human FPPS (as compared with 0.5 µM for zoledronate, under the same assay conditions). All three compounds were terpenoids: taxodone, taxodione, and arenarone. We then determined the structures of taxodione and arenarone bound to human FPPS. The unexpected result was that both terpenoids bound to the homoallylic, IPP-binding site (S2) and not to the allosteric site A, as might have been expected. The basis for this binding to the IPP site is that there are interactions between the ligand oxygen molecules and the highly conserved Arg and Lys residues that normally bind to the IPP substrate's diphosphate group with the hydrophobic terpenoid fragment interacting with a more hydrophobic site. The observation that celastrol and taxodione are both quinone methides that bind to several proteins via Michael addition (to protein thiols) and have been of interest as anticancer and antiinfective drug leads suggests that in the future it may be possible to develop analogs that more potently inhibit FPPS to provide novel multitarget inhibitors, based in part on the structural results presented here.

Methods and Materials

Computational Aspects. *MD simulations of FPPS and cluster analysis.* Systems prepared for simulations were based on the crystal structure (PDB ID code 3N6K) with the highest-affinity FPPS allosteric site inhibitor, 1-(carboxymethyl)-1H-benzo[g]indole-2-carboxylic acid (10). Two different systems were built: apo and ligand-bound. Tleap (53) was used to neutralize the systems by adding Na⁺ counter ions and solvating using a TIP3P water box. The fully solvated apo system contained 63,913 atoms, whereas the fully solvated ligand-bound system contained 65,359 atoms. Simulations were performed on each system









Fig. 9. Structures of quinone-methide adducts. (A) Structure of a celastrol (compound **9**)-thiol adduct (compound **14**), based on refs. 48 and 50 together with four potential taxodione/*N*-acetyl cysteine adducts (compounds **15–18**) together with their ¹H NMR chemical shifts predicted using ChemDraw (71) (in blue). Many other stereoisomers are possible; those shown are illustrative of the four sites of attachment (needed for NMR shift predictions). (*B*) Downfield region of the 400-MHz ¹H NMR spectrum of the taxodione/*N*-acetyl cysteine adduct showing only a single (aromatic) proton resonance in the downfield aromatic/ olefinic chemical shifts region (6.74 ppm observed, 6.82 ppm calculated, from internal tetramethylsilane) consistent with regiospecific Michael addition (as observed also with celastrol). Only two stereoisomers are possible here. (C) Summary of key nuclear Overhauser effect connectivities (from the spectrum in *SI Appendix*, Fig. S8). (*D*) Proposed structure of the taxodione/*N*-acetyl cysteine adduct showing stereospecific addition to the less sterically hindered face of the molecule. (*E*) Two possible routes for nucleophile addition. Only one isomer is formed as seen by NMR.

independently. Minimization using SANDER (53) was carried out in two stages: 1,000 steps of minimization of solvent and ions with the protein and ligand restrained using a force constant of 500 kcal⁻¹·mol⁻¹·Å², followed by a 2,500-step minimization of the entire system. An initial 20-ps MD simulation with weak restraints (10 kcal⁻¹·mol⁻¹·Å²) on the protein and ligand atoms then was used to heat the system to 300 K. Subsequently, 100-ns MD simulations were performed on both systems under constant temperature/constant pressure ensemble conditions at 300 K using AMBER (53) and the ff99SBildn force field (54, 55). Periodic boundary conditions were used, along with a nonbonded interaction cutoff of 10 Å. Bonds involving hydrogen atoms were constrained using the SHAKE algorithm (56) with 2-fs time steps.

Pocket-Volume Calculations. To quantify the degree of openness of the structures seen in the PCA, we calculated the volume of the central protein pocket (containing the Mg²⁺, IPP, and zoledronate-binding sites). POVME (44) was used for pocket-volume calculations. The crystal structure of HsFPPS in complex with zoledronate and isopentenyl diphosphate (PDB ID code 2F8Z)

was used as the reference structure. The coordinates of the following atoms were used as centers for POVME inclusion spheres: all three Mg²⁺, PA, PB, O3A, C1, and C3 of IPP, and P9, P14, C8, C18, and N15 of zoledronate. All proteins were superimposed onto 2F8Z, and all nonprotein atoms were removed for the volume calculations. Points were generated in POVME with a grid spacing of 1 Å using inclusion spheres with a 5-Å radius around the atom positions. The volume was calculated using the contiguous option (with contiguous seed spheres with a 3-Å radius centered at the same coordinates as the inclusion spheres).

PCA. The PCA was performed using the Bio3D package in R (57). The PC space was built up using 36 reported HsFPPS structures together with the three structures described here. The resulting 39 structures underwent iterative rounds of structural superposition to determine the invariant core of the protein, a region that exhibits the least structural variance among all the protein structures. This core consists of residues 21, 23–25, 45–54, 58–72, 77–106, 109–112, 115–120, 124–175, 177, 193–196, 198–201, 207–219, 225–226, 228, and 231–233. Subsequently, the experimental structures were super-

imposed onto this core, and a PCA was used (58, 59). All the experimental structures projected into the space spanned by PC1 and PC2, along which there is the most variance. The first two PCs account for 93% of all of the variance observed, and PC1 alone accounts for 88.7% of the variance observed. The PC space generated from the experimental structures served as the basis for the projection of the MD trajectories.

Experimental Aspects. *Expression and purification of HsFPPS, TbFPPS, and HsGGPPS.* The expression and purification of TbFPPS, HsFPPS, and HsGGPPS followed the protocols reported previously (17, 60, 61).

Protein crystallization, data collection, and refinement. Crystallization of HsFPPS followed the protocol reported previously with minor modifications (62). HsFPPS (23 mg/mL) was incubated with 5 mM MgCl₂ and 1 mM taxodione and 1 mM zoledronate or 1 mM taxodione and 1 mM GPP or 1 mM arenarone and 1 mM zoledronate. The mixtures were incubated on ice for 3 h, and any precipitates formed were removed by centrifugation (17,000 \times g for 5 min). HsFPPS plus inhibitor solutions then were mixed in a 1:1 ratio with reservoir buffer [1.2 M phosphate buffer (pH 5.0), 25% glycerol]. Protein and ligands mixtures were incubated using the hanging-drop method at 20 °C until hexagonal crystals appeared. Crystals then were mounted and frozen in liquid nitrogen. Diffraction data were collected at the Life Sciences Collaborative Team (LS-CAT) beam-line 21ID-F at the Argonne National Laboratory. Data were processed by using HKL3000 (63) and refined by using CCP4 (64) and Coot (65). The LigPlots (43) and Ramachandran plots were generated by Ligplot+ (66) and PDBsum (67), respectively. Protein and ligand structures were drawn using PyMOL (68).

Enzyme inhibition. HsFPPS, TbFPPS, and HsGGPPS inhibition assays were carried out as described previously (17, 20, 62). Compounds first were screened at 25 μ M using a PPi release assay (69); then full dose–response curves were obtained for the actives, and IC₅₀ values were obtained using the Prism program (www.graphpad.com). The screening libraries were obtained from the Drug Synthesis and Chemistry Branch, DPT/NCI. The purity of key compounds is shown in *SI Appendix*, Fig. S10.

Inhibition of tumor-cell growth. MCF-7 cell growth inhibition assays followed the basic protocol described previously (70) with slight modifications. Cells were subcultured in DMEM plus 10% (vol/vol) FBS. Cells were grown at 37 °C in a 5% (vol/vol) CO₂ atmosphere. Five thousand cells per well were inoculated with compounds in a total of 90 μ L medium covered with a gaspermeable sealing membrane (catalog no. BEM-1; Diversified Biotech) and wrapped by Parafilm, to avoid evaporation. Plates then were incubated for 4 d at 37 °C in 5% CO₂. Cancer cell inhibition assays were carried out by using

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a 3-(4,5-dimethylthiazole-2-yl)-2,5-diphenyltetrazolium bromide (MTT) cell proliferation assay kit (30–1010K; ATCC). After incubation, 10 μ L of MTT reagent was added to each well, and plates were incubated for 3 h at 37 °C in a 5% CO₂ atmosphere. After incubation, 100 μ L of detergent (SDS) was added to each well to stop the reaction. After overnight incubation at room temperature in the dark, cell densities were counted by using a UV-VIS spectrophotometer at 570 nm. Dose–response curves and corresponding IC₅₀s were fitted by using program Prism (www.graphpad.com).

DSC. DSC experiments were carried out using a Microcal VP-DSC instrument. The HsFPPS protein concentration was 30 μ M in 25 mM Tris buffer (pH 7.5), 25 mM NaCl, and 5 mM MgCl₂. Zoledronate was added from an aqueous stock solution; taxodione and arenarone were from 20-mM stock solutions in DMSO. DMSO [final percentage ~1.5% (vol/vol)] had no effect on the thermal transition. The scans covered the range of 10 °C to 90 °C at a scan rate of 10 °C/h for all systems. All transitions were irreversible. The DSC thermograms were processed by using Origin 7.1 software (www.sigmaplot.com). Buffer vs. buffer scans were used for baseline correction.

Electrospray-ionization mass spectrometry. Spectra of 100 μ M HsFPPS in the absence or presence of 100 μ M taxodione (compound **11**) or celastrol (compound **9**) were obtained by using a Waters Quattro Ultima electrospray ionization mass spectrometry system (Waters Corp.). Samples were incubated in 10 mM Tris (pH 7.4), 25 mM NaCl, 100 μ M inhibitor, 0.5% DMSO, for 15 min at 23 °C.

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SI Appendix

Taxodione and Arenarone Inhibit Farnesyl Diphosphate Synthase by Binding to the Isopentenyl

Diphosphate Site

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SI Appendix

SI Materials and Methods

Compounds 9, 11, 12 and 13 were obtained from the Drug Synthesis and Chemistry Branch, DTP, Division of Cancer Treatment and Diagnostics, NCI (Bethesda, MD). Compound 10 (NCI-9037) was purchased from Aldrich (Milwaukee, WI). The structures of all compounds investigated were confirmed by using ¹H NMR spectroscopy at 400 MHz or 500 MHz on Varian (Palo Alto, CA) Unity spectrometers. The gCOSY and NOESY spectra were obtained at Spectral Data Services, Incorporated, Urbana, Illinois, using an Agilent Inova400. HPLC was performed using an Agilent LC/MSD Trap XCT Plus system (Agilent Technologies, Santa Clara, CA) with a 1100 series HPLC system including a de-gasser, an autosampler, a binary pump, and a multiple-wavelength detector. High-resolution mass spectra were obtained at the University of Illinois Mass Spectrometry Laboratory.

Celastrol (9) HRMS (ESI) m/z calcd. for $C_{29}H_{39}O_4$ [M+H⁺] 451.2848, found 451.2853. 99.5 % pure as determined by analytical HPLC.

Compound **10** (NCI-9037) HRMS (ESI) m/z calcd. for $C_{19}H_{13}O_6$ [M+H⁺] 337.0712, found 337.0710. 92.4 % pure as determined by analytical HPLC.

Taxodione (11) ¹H NMR (500 MHz, CDCl₃): δ 7.57 (s, 1H), 6.88 (s, 1H), 6.21 (s, 1H), 3.11 - 3.05 (m, 1H), 2.60 (s, 1H), 1.82-1.40 (m, 6H), 1.27 (s, 6H), 1.18 (d, *J* = 6.5 Hz, 3H), 1.16 (d, *J* = 6.5 Hz, 3H), 1.12 (s, 3H). HRMS (ESI) m/z calcd. for C₂₀H₂₇O₃ [M+H⁺] 315.1960, found 315.1967. 95.2 % pure as determined by analytical HPLC.

Taxodone (12) HRMS (ESI) m/z calcd. for $C_{20}H_{29}O_3$ [M+H⁺] 317.2117, found 317.2118. 92.2 % pure as determined by analytical HPLC.

Arenarone (13) HRMS (ESI) m/z calcd. for $C_{21}H_{29}O_2$ [M+H⁺] 313.2168, found 313.2167. 98.9 % pure as determined by analytical HPLC.

Analyzed data are compiled in Fig. S9.



N-acetyl-S-((4a*S*,9*S*,10a*S*)-5,6-dihydroxy-7-isopropyl-1,1,4a-trimethyl-10-oxo-1, 2, 3, 4, 4a, 9, 10, 10a- octahydrophen- anthren-9-yl)-L-cysteine (compound **17**)

To a solution of taxodione (**11**) (1.4 mg, 0.0044 mmol) in CD₃OD (0.3 mL) was added N-acetylcysteine (0.76 mg, 0.0046 mmol) in CD₃OD (0.3 mL), and the reaction was stirred for 4 hrs at 37 °C. The product was analyzed without further purification. ¹H NMR (400 MHz, CD₃OD): δ 6.74 (s, 1H), 4.87 - 4.81 (m, 1H), 4.11 (s, 1H), 3.41 (s, 1H), 3.21 – 3.14 (m, 2H), 2.73 – 2.65 (m, 1H), 2.08 (s, 3H), 1.80 - 1.72 (m, 2H), 1.58-1.53(m, 2H), 1.40 (s, 3H), 1.39 - 1.34 (m, 2H), 1.25 (s, 3H), 1.21 (d, *J* = 7.0 Hz, 3H), 1.18 (d, *J* = 7.0 Hz, 3H), 1.04 (s, 3H). HRMS (ESI) m/z calcd. for C₂₅H₃₆NO₆S [M+H⁺] 478.2263, found 478.2243.

| | חו | HsFPPS | TbFPPS | HsGGPPS | MCF-7 | |
|-----------|----|-------------|-------------|---------------|-------------------|--|
| | U | (PPi assay) | (PPi assay) | (radio assay) | (MTT assay) | |
| Celastrol | 9 | >200 | 17.1 | 31.9 | 0.2 | |
| NSC9037 | 10 | 81.0 | 54.2 | >200 | ^a N.D. | |
| Taxodione | 11 | 1.2 | 17.3 | 19.8 | 2.0 | |
| Taxodone | 12 | 2.4 | 43.1 | 46.3 | ^a N.D | |
| Arenarone | 13 | 1.1 | 27.8 | 21.2 | 17.1 | |
| • | | | | | | |

Table S1. HsFPPS, TbFPPS, HsGGPPS and MCF-7 tumor cell inhibition (IC $_{50}$ values in μ M).

^aN.D.: not determined.

PDB ID Volume Conformation Ligand (Å³) code bisphosphonate (YS0470) 4H5D 445 closed bisphosphonate (zoledronate), PPi 2F8C 453 closed bisphosphonate (YS0470), IPP 455 4H5E closed bisphosphonate (zoledronate), IPP 1ZW5 462 closed 2F89 462 bisphosphonate (pamidronate) closed 2F94 466 bisphosphonate (ibandronate) closed bisphosphonate (BPH-1260) 4GA3 467 closed 2F8Z 469 bisphosphonate (zoledronate), IPP closed bisphosphonate (zoledronate), Novartis inhibitor 472 3N46 closed (NOV 980) 4P0W 472 bisphosphonate (zoledronate), Arenarone closed 2F9K 473 bisphosphonate (zoledronate) closed 2F92 482 bisphosphonate (alendronate) closed 2VF6 485 bisphosphonate (minodronate) closed 4L2X 488 bisphosphonate (CL02134) closed 1YV5 501 closed bisphosphonate (risedronate) 20PM 506 closed bisphosphonate (BPH-461) 3B7L 508 closed bisphosphonate (minodronate) 1YQ7 bisphosphonate (risedronate) 512 closed 4P0V 512 closed bisphosphonate (zoledronate), Taxodione bisphosphonate (zoledronate), Novartis inhibitor 3N45 516 closed (FBS 04) 3S4J 531 closed bisphosphonate (risedronate) 3RYE 536 bisphosphonate closed 537 2QIS closed bisphosphonate (risedronate) bisphosphonate (YS0470), Pi 4H5C 550 closed 4DEM 557 bisphosphonate (YS 04 70) closed 2RAH 582 closed bisphosphonate 3CP6 601 closed bisphosphonate 20PN 607 closed bisphosphonate (BPH-527) 4JVJ 626 closed bisphosphonate (CL01131) Avg, closed 508±50 2F7M 817 apo (unliganded) open 3N5J 830 Novartis inhibitor (NOV 311) open 4P0X Taxodione 845 open 847 3N5H Novartis inhibitor (NOV 304) open 3N1V 852 open Novartis inhibitor (FBS 01) 3N3L 859 Novartis inhibitor (FBS 03) open 3N6K 870 Novartis inhibitor (NOV 823) open Novartis inhibitor (FBS 02) 3N1W 878 open 3N49 Novartis inhibitor (NOV 292) 886 open 1FPS 893 apo (unliganded) open Avg, open 858±24

Table S2. Pocket-volume results.

Fig. S1. Structures of the 50 compounds obtained from the NCI/DTP collection that were screened for inhibition of HsFPPS and TbFPPS. The numbers shown are NSC (NIH/DTP) code numbers initially.





Fig. S2. Structures of the 25 compounds from the first similarity search (on 9) tested against HsFPPS and TbFPPS. The numbers shown are NSC (NIH/DTP) code numbers.



Fig. S3. Structures of the 15 compounds based on a similarity search (on **11**), tested against HsFPPS. NSC122420 (**12**) is taxodone; NSC 613794 is arenarone (**13**).



Fig. S4. 2Fo-Fc map of ligands calculated at 1.0σ. (A) Taxodione+zoledronate (PDB ID 4P0V). (B) Taxodione (2 molecules; PDB ID 4P0X). (C) Arenarone+zoledronate (PDB ID 4P0W).



Fig. S5. Protein-ligand interactions in taxodione+zoledronate HsFPPS structure (PDB ID 4P0V).



Fig. S6. Protein-ligand (and ligand-solvent) interactions in the taxodione structure (PDB ID 4P0X). (A) One ligand binds in the IPP site. (B) One ligand is solvent accessible.







Fig. S8. High resolution mass spectrometry and NMR data for 17.

| Elementa | I Composition | Report | | | | | | | | Page 1 |
|---|---|--|--|--|---|-------------------------------------|----------|-------|-------------------------|--|
| Single Ma Tolerance = Element pr Number of | iss Analysis = 10.0 PPM / D ediction: Off isotope peaks us | BE: min = -1 ed for i-FIT = | .5, max = 6 : 3 | 800.0 | | | | | | |
| Monoisotopii 45 formula(e Elements Us C: 0-125 wang, ke⊐, W Qtof_50983 3 | c Mass, Even Elect e) evaluated with 1 sed: H: 0-250 N: 1-3 /-14-04 0 (2.246) AM (Cen,3, | ron lons results within li 6 O: 5-7 S 80.00, Ar,15000 | imits (all rest 5: 1-1 Univer: 0.0,716.46,0.7 | ults (up to 10 sity of Illnois, \$ 0,LS 3); Sm (\$ | 00) for each n GCS, Mass Spec GG, 2x3.00); Cm | nass) ctrometry Lab ו (30:33) | | | 1 | Q-tof UE52 1: TOF MS ES+ 2.91e+00: |
| 100 % 473.7 | 976 474.2097 47 | 476.: 5.2144 | 2092 477.2 | 2150 478.2 | 2243 479.22 | 89 480.2225 | 481.1993 | 482.8 | ³⁵²⁷ 483.240 | 2 483.6600 |
| 473.0 | 474.0 475 | .0 476.0 | 477.0 | 478.0 | 479.0 | 480.0 | 481.0 | 482.0 | 483.0 | 484.0 |
| Minimum: Maximum: | | 5.0 | 10.0 | -1.5 600.0 | | | | | | |
| Mass | Calc. Mass | mDa | PPM | DBE | i-FIT | Formula | | | | |
| 478.2243 | 478.2263 | -2.0 | -4.2 | 8.5 | 0.2 | С25 Н36 | N 06 S | | | |

B

¹H NMR: **11** + N-acetylcysteine in CD₃OD at 37 °C (4 hrs)





Fig. S9. ESI-MS of HsFPPS (100 μ M) with 100 μ M inhibitor. (A) HsFPPS. (B) HsFPPS+Taxodione (11). (C) HsFPPS+Celastrol (9).



HPLC(UV)/MS analysis of Celastrol (9)















