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Structure-based *In Silico* Screening Identifies a Potent Ebolavirus Inhibitor from a Traditional Chinese Medicine Library

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ABSTRACT

Potent Ebolavirus (EBOV) inhibitors will help to curtail outbreaks such as that which occurred in 2014-16 in West Africa. EBOV has on its surface a single glycoprotein (GP) critical for viral entry and membrane fusion. Recent high resolution complexes of EBOV GP with a variety of approved drugs revealed that binding to a common cavity prevented fusion of the virus and endosomal membranes, inhibiting virus infection. We performed docking experiments, screening a database of natural compounds to identify those likely to bind at this site. Using both inhibition assays of HIV-1-derived pseudovirus cell entry and structural analyses of the complexes of the compounds with GP we show here that two of these compounds attach in the common binding cavity, out of eight tested. In both cases two molecules bind in the cavity. The two compounds are chemically similar but the tighter binder has an additional chlorine atom that forms good halogen bonds to the protein and achieves an IC_{50} of 50 nM, making it the most potent GP-binding EBOV inhibitor yet identified, validating our screening approach for the discovery of novel anti-viral compounds.

INTRODUCTION

Ebola hemorrhagic fever, a deadly disease infecting both human and nonhuman primates, is caused by the highly virulent negative-stranded RNA, membrane-enveloped filovirus - EBOV. The 2014-16 West African outbreak claimed over 11,000 lives since suitable therapeutics were not available. The membrane envelope of EBOV is decorated by trimers of GP, each monomer of which is cleaved by furin into two polypeptides, GP1 and GP2. GP is solely responsible for host cell attachment, endosomal entry and membrane fusion,¹⁻⁸ making it an obvious target for therapeutic intervention. A large number of FDA approved drugs have been found to be active against EBOV infection *in vitro* using either EBOV or pseudotyped virus assays,⁹⁻¹⁷ however

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3 the precise mechanisms of inhibition remain largely unknown. We have recently demonstrated,
4 using X-ray crystallography, that nine such drugs (Figure S1) interact directly with EBOV
5 GP.¹⁸⁻²⁰ The approved drugs bind in a cavity between the attachment (GP1) and fusion (GP2)
6 subunits, stabilised by predominantly hydrophobic interactions. The cavity lies at the entrance
7 to a large tunnel linking to equivalent tunnels from the other monomers of the trimer at the 3-
8 fold axis. Residues lining the binding site are highly conserved amongst filoviruses, with the
9 exception of Marburg viruses (MARVs). The cavity is occupied by residues 192-194 (DFP lid,
10 which immediately follow the putative cathepsin B/L cleavage site) in the apo structure of the
11 GP. Inhibitor binding expels the DFP lid from the cavity, reducing the stability of the protein
12 as judged by its melting temperature. These results suggested that inhibitor binding might
13 trigger premature release of GP2, preventing fusion between the viral and endosome
14 membranes. Alternatively since inhibitor binding alters the conformation of the cathepsin B/L
15 cleavage site, it might inhibit cleavage, preventing removal of the glycan cap domain, so
16 blocking engagement of GP with its receptor NPC1.^{19, 20}

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36 The discovery of an inhibitor binding site on EBOV GP offers opportunities for structure-based
37 drug design against EBOV. Natural compounds have been shown to be effective against
38 different stages of viral infection,^{21, 22} and have considerable structural diversity and remain a
39 major source of new drugs. We have therefore performed structure-based *in silico* screening of
40 a traditional Chinese medicine database against EBOV GP to identify novel drug leads. This
41 approach has been combined with thermal-shift assays, pseudovirus entry assays and
42 crystallography to identify and validate potential inhibitors. Our study reveals that although the
43 predictive power of the *in silico* screening is limited, it still identified two novel compounds
44 (out of eight tested) that display inhibitory activity, as confirmed by pseudovirus entry assays
45 and proof of binding from crystallography. Indeed one of these compounds appears to be the
46 most potent GP binder yet identified.

RESULTS

Virtual Screening Method Validation Using a Set of Known Binders

Our previous work provides a set of 8 drugs known to inhibit EBOV by direct interaction with the GP (Figure S1).¹⁸⁻²⁰ To validate the docking methods, all drugs were subjected to a virtual screening workflow, which we established using the Schrödinger suite (<http://www.schrodinger.com/>). The IC₅₀ values of the drugs against EBOV¹⁰ were converted to pIC₅₀ (-log IC₅₀) values and together with the docking scores (Glide XP^{23, 24} and QPLD [quantum mechanics–polarised ligand docking]²⁵) are listed in Table S1. The correlation between the docking scores and pIC₅₀ values are shown in Figure 1. Docking scores of Glide XP show only very weak correlation to experimental pIC₅₀ values (R²=0.18), whereas docking scores of QPLD have better correlation to the experimental pIC₅₀ values (R²=0.51), although, given the small number of compounds tested this result is not in itself robust. We think that the relatively poor correlation between the docking scores and the experimental pIC₅₀ values may be attributed to the conformational flexibility of the side chains within the binding pocket of the GP, which cannot be accounted for by the docking program. Nevertheless, this validation method suggests that our virtual screening workflow combining Glide XP docking and QPLD may be able to select binding compounds for the target Ebola GP (although both false positives and negatives would also be expected). As QPLD Emodel scores show some correlation with the experimental IC₅₀, we used these to rank screened compounds for conducting further experiments (QPLD was also found to be useful for the prediction of binding to another viral protein, suggesting general utility²⁶).

Virtual Screening of Novel Natural Compound Inhibitors

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3 To identify novel inhibitors of Ebola GP, we screened the ZINC natural compound library from
4 the Traditional Chinese Medicine database.²⁷ Out of nearly 2.5 million compounds, high
5 throughput virtual screening (HTVS) selected 416 compounds for subsequent docking
6 calculations. Among these candidates, 88 compounds were selected based on their Glide XP
7 docking and ligand efficiency scores using scores from a known inhibitor (toremifene) as cut-
8 off values. QPLD calculations further reduced the list to 16 compounds, all of which have
9 passed filters for pan assay interference compounds.²⁸ A total of eight of these best-scoring
10 compounds were purchased for *in vitro* experiments and crystallographic studies based on
11 availability and price (Figure 2 & Table S2).
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24 **Evaluation of the Virtual Screen Results by Thermal Shift Assay and Crystallography**

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27 We first performed thermal shift assays to test if the eight selected compounds could perturb
28 the thermal stability of GP. The results show that compounds ZINC32540717 (**118**) and
29 ZINC09410451 (**118a**) [derivatives of natural isoflavones²⁹] interact with the dye (SYPRO
30 Orange) and interfere with the fluorescence emission; the remaining six compounds at pH 5.2
31 and at 500 μ M concentration do not alter the melting temperature of the GP (data not shown).
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33 Nevertheless, we then carried out crystal soaking experiments at two compound concentrations,
34 2.5 mg/ml and 5.0 mg/ml for all compounds. For each compound eight crystals were soaked,
35 four at each concentration for 5 to 20 min. Soaked crystals were mounted in loops and frozen
36 in liquid nitrogen for diffraction data collection on beamlines I04-1 and I24 of Diamond Light
37 Source. High multiplicity X-ray data were collected from crystals soaked with compounds **118**
38 and **118a** to 2.05 Å and 2.30 Å, respectively. $|F_o-F_c|$ difference electron density maps phased
39 with rigid-body refined models based on our previously published GP-bepridil structure,
40 excluding the ligand and water molecules¹⁸, indicated that compounds **118** and **118a** bind to
41 GP (Figure 4). No binding was observed for the other six compounds, for data collected under
42 the same regime.
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Compounds **118** and **118a** inhibit Ebola pseudovirus infection

Compounds **118** and **118a** were tested for their ability to inhibit EBOV infection *in vitro*, using HIV-1-derived pseudoviruses expressing the Ebola virus envelope glycoproteins (EBOV pseudoparticle, EBOVpp) as described previously.¹⁹ We used TZM-bl cells in the EBOVpp infection assay, since TZM-bl cells contain a β -Gal expression cassette with an HIV-1-induced promoter, infected cells can be identified through hydrolysis of X-gal.^{30, 31} The best-known inhibitor that directly interacts with EBOV GP, toremifene,¹⁸⁻²⁰ was used as a positive control. Multiple concentrations (0.01 to 25 μ M) of **118**, **118a** and toremifene were evaluated in the EBOVpp infection assay and the experiment was done in triplicate (Figs 3 & S2). The results show that all three compounds inhibit EBOVpp infection and fusion (Figure S2) in a dose-dependent manner. The IC_{50} s derived from the experiment are $3.1 \pm 0.02 \mu$ M, $0.05 \pm 0.01 \mu$ M and $0.09 \pm 0.08 \mu$ M for **118**, **118a** and toremifene respectively. Thus, **118a** has the lowest IC_{50} among the inhibitors known to bind EBOV GP directly.¹⁸⁻²⁰ Although the experiments were not performed on live EBOV, the relative ranking of inhibition constants is likely to be indicative of relative potency against EBOV.

Overall structures of GP-**118** and GP-**118a** complexes

The complexes were refined with good R-factors and stereochemistry (Table 1). The resultant electron density maps unambiguously show the binding of the compounds. In both cases there are two inhibitor molecules bound in each GP binding pocket (Figure 4). Hereafter we name the molecule that binds closest to Y517 as molecule I (this is the most interior and presumably the tighter binder) and that closest to M548 as molecule II.

There is no electron density for the pyrazole ring of **118** molecule I although other groups of the molecule have reasonably well defined density (Figure 4C). We initially thought that the density might represent an impurity molecule that is very similar to compound **118** produced

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3 during its synthesis. However, the NMR spectrum showed no sign of other molecules in the
4 sample. Since the pyrazole ring can potentially undergo hydrolysis, it is conceivable that for
5 some molecules the pyrazole ring of **118** I is hydrolysed during crystal soaking.^{32, 33}
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11 The overall structures of the protein parts of the GP–**118** and GP–**118a** complexes are very
12 similar to each other, as well as to the previously published GP–drug complex structures.^{18, 19}
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14 Apart from some local conformation changes around the binding cavity, the binding of
15 different inhibitors does not introduce significant variations in the overall structure of the
16 protein. For example, by superimposition of these complexes using SHP,³⁴ GP–**118a** overlaps
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18 386 (out of 388), 382 and 381 C_αs of GP–**118**, GP–toremifene and the unliganded GP with
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20 rmsds of 0.38 Å, 0.53 Å and 0.55 Å, respectively.
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28 **Two molecules of 118a and 118 bind in each cavity of GP**

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32 The inhibitor-binding site of EBOV GP is located between the N-terminus of GP1 and the stem
33 of the GP2 fusion loop (Figure 4). In the apo structure the inhibitor-binding cavity is occupied
34 by residues 192-194 (the DFF lid) of GP1, which may function to hold the putative cleavage
35 site³⁵⁻³⁹ in position for the removal of the glycan cap by the host cathepsin B/L – allowing
36 binding of the receptor NPC1 in the late endosome/lysosome.^{19, 40, 41} Binding of an inhibitor in
37 the cavity expels the DFF lid. The inhibitor-binding cavity is also the entrance of a tunnel that
38 connects with the corresponding tunnels in the other monomers of the GP trimer at the three-
39 fold axis. The β1–β2 hairpin, β3, β6 and β13 of GP1, and the stem of the fusion loop (β19–β20)
40 and α3 of GP2 contribute residues lining the inhibitor-binding pocket (Figure 4B & S3). The
41 volume occupied by F193 and F194 (the FF volume) in apo GP is important for inhibitor
42 binding, and is occupied by all inhibitors whose complex structures with GP are known.¹⁸⁻²⁰ In
43 the cases of benztropine and imipramine, this is achieved by two drug molecules, one molecule
44 occupies part of the volume in front of M548 and a second molecule fills the space in front of
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3 Y517. Despite **118a** and **118** being the largest inhibitors known to bind GP, once again in each
4 case two inhibitor molecules bind (Figs. 4 & S3). Compound **118a** has a molecular volume of
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6 382 Å³, and, excluding atoms lying outside the cavity, the two bound molecules alone sample
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8 about 640 Å³ of the total ~1000 Å³ volume of the pocket (in contrast the previous nine
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10 inhibitors, with molecular volumes ranging from 188 Å³ for ibuprofen to 362 Å³ for toremifene,
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12 in aggregate occupy 878 Å³)
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17 18 **Interactions between EBOV GP and 118a**

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21 Molecule I of compound **118a** binds with its chlorophenyl ring deep in the sub-pocket adjacent
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23 to residues V66 and A101, making extensive interactions with the side-chains of residues
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25 V106, A101, L515 and Y517, as well as main-chain atoms of G67 and G102 (Figure 5B). This
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27 sub-pocket is partially occupied by F194 in apo GP, by a phenyl ring in toremifene, the
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29 benzodioxol ring of paroxetine and the phenyl ring of bepridil in their complex structures. The
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31 chlorine atom makes a strong halogen bond with the carbonyl oxygen of G67 with a bond
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33 distance of 3.1 Å, C–Cl–O angle of 167° and Cl–O–C angle of 116° (a classic halogen bonding
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35 interaction of chlorine with the backbone Lewis bases at a glycine residue).⁴² The V66 side-
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37 chain in this sub-pocket rotates to avoid clashes on binding. The methylpyrazole group, apart
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39 from the close contacts with the corresponding group of molecule II as discussed below, is
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41 positioned to make parallel ring stacking interactions with the side-chain of Y517 and
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43 hydrophobic interactions with L515 and M548. The hydroxyphenoxy ethyl moiety interacts
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45 extensively with the side chains of its flanking residues, R64 and T519. The position and
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47 orientation of the phenoxy ring is similar to the phenoxy and benzyl ring of bound toremifene
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49 and bepridil respectively. The piperidine carboxamide group extends fully into the tunnel,
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51 exploiting protein interactions not used by other known GP binders. Upon binding, residue
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53 D522 refolds towards and makes bifurcated hydrogen bonds (of length 3.0 Å and 3.2 Å) with
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3 the nitrogen group of the piperidine ring. In addition the carboxamide moiety hydrogen-bonds
4 to the side-chains of N61 and R587 (from a neighbouring monomer) (Figure 5B).
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9 Compound **118a** molecule II, binds the GP with its chlorophenyl group nestled in a sub-pocket
10 adjacent to $\alpha 3$ interacting with the side-chains of I38, L186, M548 and L554 (Figure 5A). This
11 sub-volume is occupied by F193 in the apo structure, and also by inhibitors in other inhibitor
12 complexes, for example by a phenyl ring of benztropine molecule A and the isobutoxy group
13 of bepridil. The chlorine atom makes a halogen bond with the carbonyl oxygen of L554 with a
14 bond distance of 3.7 Å, C–Cl–O angle of 143° and Cl–O–C angle of 106°, although this is less
15 ideal geometry than that seen in molecule I. The methylpyrazole ring of molecule II is
16 sandwiched between, and extensively contacted by, L186 and the pyrazole ring of molecule I.
17 The methyl group contacts all five non-hydrogen atoms of the pyrazole ring of molecule I, and
18 the interactions are so intimate (separation 3.2-3.8 Å) that the electron density of the two groups
19 is connected even at high contour level (Figure 4D), which may not be favorable for binding.
20 The hydroxyphenoxy group of **118a** molecule II makes off-centre ring stacking interactions
21 with P187, and contacts the side-chain of M548. The hydroxyphenoxy group is also protected
22 from solvent by the main-chain of residues 189-191, the putative cathepsin B/L cleavage site,
23 which becomes partially ordered in the complex. The piperidine carboxamide moiety hangs
24 out of the binding cavity and has weak electron density.
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47 Several water molecules are trapped in the binding cavity. Three have direct interactions with
48 the inhibitor, one bridges interactions from the carboxamide to the carboxyl group of E100 and
49 carbonyl oxygen of L63, another hydrogen-bonds to the hydroxyl oxygen of the
50 hydroxylphenoxy; the third hydrogen-bonds to the pyrazole ring of molecule II.
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57 **Interactions between EBOV GP and 118**

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3 Compared to **118a**, compound **118** has phenyl and pyrazole groups instead of the chlorophenyl
4 and methylpyrazole groups. As noted above, the pyrazole ring of **118** molecule I appears to be
5 hydrolysed. In addition, the hydroxyl group of the hydroxyphenoxy moiety may be modified
6 since there is extra density connected to this group. The rest of **118** molecule I is bound in a
7 very similar fashion to molecule I of **118a**, the hydrogen bond interactions from the piperidine
8 carboxamide group and even the nearby water molecules are conserved (Figure 6B). The
9 phenyl ring is positioned similarly in the sub-pocket adjacent to V66 and A101, however,
10 lacking the chlorine atom, it does not make any interactions with the main-chain of G67 and
11 G102. Molecule II of **118**, binds in a similar position to molecule II of **118a** (Figure 6A),
12 although since it lacks the chlorine atom on the phenyl ring and the methyl group on the
13 pyrazole ring, it is positioned somewhat deeper in the cavity and closer to molecule I. The
14 phenyl and pyrazole rings make similar interactions with I38, L186, M548, L554 and with
15 molecule I to those made by molecule II of **118a**. The hydroxyphenoxy moiety makes fewer
16 contacts to P187 and has no interactions with the putative cathepsin B/L cleavage site (residues
17 190-191), which is disordered.

38 **Structural changes introduced by inhibitor binding**

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41 All eleven inhibitors, of considerable chemical diversity¹⁸⁻²⁰, bind within the same hydrophobic
42 cavity, with affinity derived from shape complementary enabled by small conformational
43 changes in the protein. Superimposition of inhibitor bound structures on apo GP shows that
44 whilst inhibitor binding does not introduce significant main-chain structural changes around
45 the major binding area of the cavity (Figure 7A), there are various side-chain rearrangements,
46 most notably for residues V66, M548, L554 and L558. V66 changes conformation to allow
47 binding of different chemical groups in the sub-pocket adjacent to it, whereas M548, L554 and
48 L558 changes are associated with different shaped groups occupying the sub-volume adjacent
49 to $\alpha 3$. The piperidine carboxamide of **118** or **118a**, and the dimethylethanamine group of
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3 toremifene are positioned to make direct interactions with D522 via either hydrogen bonds or
4 hydrophobic contacts and stabilize the N-terminal end of the fusion loop (residues 522-526) in
5 a different conformation to the apo form (for smaller inhibitors these residues become
6 disordered, and show only weak electron density) (Figure 7B). The structural changes, in turn,
7 lead to ordering of two or three residues contributed from the expression vector pNeosec at the
8 N terminus of GP1.
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18 **Comparison between the predicted and observed binding modes.**

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21 The QPLD docking algorithm docked both **118** and **118a** compounds at the site corresponding
22 to molecule I of the crystal structure with the phenyl or chlorophenyl ring in the sub-pocket
23 adjacent to V66 and A101 (Figure 8 and Table S3 & S4). However, the pyrazole ring in both
24 cases tilts away from Y517. Since the side-chain of D522 points away from the binding site in
25 the structure used for docking, the docking program was unable to predict the hydrogen bond
26 interactions to the piperidine ring that require a side-chain rotation of 180°. The hydrogen bond
27 between the carboxamide group and N61 was predicted for compound **118**. We used the
28 structure of GP observed when toremifene binds for the *in silico* screening. In this structure,
29 the side-chain of L554 partially occupies the sub-pocket adjacent to $\alpha 3$ where the chlorophenyl
30 ring of **118a** molecule II (or phenyl ring of **118**) is bound, perhaps explaining why the two
31 compounds were not docked at the site.
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50 **DISCUSSION AND CONCLUSIONS**

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53 Compound **118a** is the best EBOV inhibitor known to directly interact with the viral GP. Its
54 potency is about two-fold better than toremifene. Two molecules of **118a** bind each monomer
55 of GP whereas only one molecule of toremifene binds each monomer of GP. Molecule I of
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3 **118a** has stronger electron density and an average B-factor 75% lower than for molecule II,
4 and is therefore the major contributor to inhibitory potency. In-line with this, molecule I of
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6 **118a** overlaps well with its predicted binding position and also with bound toremifene and
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8 bepridil (Figure 7). By comparing binding modes and potencies we previously noted that the
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10 FF volume and the sub-volumes adjacent to V66 and $\alpha 3$ are crucial for binding affinity.^{18, 20}
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12 Here we show the piperidine carboxamide group in molecule I of **118a** exploring additional
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14 volume inside the tunnel and making hydrogen bonds with the protein. We have previously
15
16 suggested that substitution of the chlorine atom of toremifene with a benzyl ring to occupy the
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18 sub volume adjacent to $\alpha 3$ to mimic the interactions made by clomipramine and thioridazine
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20 might improve the potency of toremifene (Figure 7). With knowledge of the GP-**118a** structure
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22 we suggest that a further modification to toremifene by substituting the dimethylamine group
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24 with the piperidine carboxamide group of **118a** may greatly increase its potency. Similarly,
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26 modifications could also be made to bepridil by replacing the isobutoxy group with a benzyl
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28 ring and addition of an oxyethylpiperidine-4-carboxamide group of **118a** to its benzyl ring. As
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30 more GP complex structures with chemically divergent inhibitors are determined, the
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32 knowledge of protein-inhibitor interactions will guide design of potent drugs to combat Ebola
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34 virus disease.
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43 This study reveals that a structure based high throughput *in silico* screen in combination with
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45 an inhibitory assay of EBOVpp and crystallography can be an effective way to identify highly
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47 potent small molecule inhibitors effective against EBOV. Since only the top hits of the screen
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49 need to be verified experimentally, the method is much more efficient in the requirements of
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51 both time and manpower compared to viral or pseudovirus entry assays. Nevertheless it should
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53 be borne in mind that only two of the eight compounds selected by *in silico* screening showed
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55 inhibitory properties. This probably reflects the limited reliability of the scoring functions used
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57 and also perhaps the difficulty of predicting binding in the face of extensive side chain
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3 flexibility in the binding cavity. For such flexible targets we suggest that, where a data base of
4 potential binding cavity structures is experimentally available then screening against all
5 possible structures and selecting the best docking score might increase robustness. A
6 fundamental limitation of course will remain – the method can only identify the inhibitors that
7 directly interact with EBOV GP. Despite these caveats the method used was able to identify
8 two inhibitors of a novel chemical group of EBOV GP inhibitors, one of which represents the
9 most potent known to directly interact with the GP. Given its strong potency **118a** should be
10 tested *in vivo* using the murine infection model reported by Johansen *et al.* to determine its
11 protective ability.¹⁰
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24 Both inhibitors bind with a unique binding mode, especially their piperidine carboxamide
25 group, exploiting hydrogen-bond interactions that have not been seen before, whilst, in the case
26 of 118a, the presence of strong halide bonding is likely to explain much of the additional
27 potency. The inhibitor-binding cavity of the GP is large, and can accommodate various
28 inhibitors with chemically divergent structures, so that we believe that features such as the
29 halide bonding might be usefully grafted onto other chemical scaffolds. Such approaches could
30 provide more potent inhibitors to combat EBOV infection, indeed, several compounds have
31 been designed based on these structures and will be made and tested soon.
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47 **EXPERIMENTAL SECTION**

48 **Data collection and ligand library preparation**

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50 The natural ligand library comprising about 2.5 million compounds was downloaded from the
51 Traditional Chinese Medicine (TCM) database@Taiwan.²⁷ Prior to screening of the natural
52 ligand library, a drug candidate list with proven inhibitory activity against EBOV was
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3 collected.¹⁰ 8 compounds with known IC₅₀ values and known complex structures with EBOV
4 GP were used for the evaluation of our *in silico* workflow. Molecular structures of all drugs
5 were retrieved from the Drug Bank.⁴³ Ligands were prepared for simulation using the ligprep
6 module from the preparation step of the high throughput virtual screening workflow of
7 Schrödinger suite (<http://www.schrodinger.com/>).
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14 15 16 **Docking structure preparation**

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19 The crystal structure of EBOV glycoprotein in complex with toremifene was taken from the
20 Protein Data Bank (PDB ID 5JQ7).¹⁹ The protein structure was pre-processed using the protein
21 preparation wizard of Schrödinger /Maestro 11.1. The processed structure was subjected to
22 energy minimization using the OPLS3 force field in the Impact module. The grid box for
23 docking was created in Glide^{23, 24} by picking toremifene as the centre and expanding the box
24 size to cover residues of the whole binding pocket. The final grid box dimensions were 44.9 ×
25 15.6 × 8 Å³.
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36 37 **Virtual screening and binding affinity calculation**

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39 The natural ligand library was subjected to three levels of docking using the virtual screening
40 workflow in Glide.^{23, 24} Each molecule was docked in the high-throughput virtual screening
41 (HTVS) mode, from which the top 10% of the compounds were selected for standard precision
42 (SP) docking followed by refinement in the extra precision (XP) docking. The last step was
43 crucial to reduce false positives returned from SP and better predict binding poses using a more
44 expensive scoring function. The final docking poses and binding affinities of known inhibitors
45 and candidate compounds returned from XP docking were subjected to QM-polarized ligand
46 docking (QPLD) calculations²⁵. This method combines Glide docking with QSite to redock
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3 ligands using quantum mechanically derived partial charges on them in the pocket accounting
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5 for the polarization effect from the protein.
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8 **Reagents**

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10 The eight selected compounds used for evaluation of the Virtual Screen Results were purchased
11 from MolPort with specified purity of > 90%. The high degree of purity of compound **118** was
12 further confirmed by NMR analysis, and together with **118a**, demonstrated to be the active
13 component by crystallographic structure determination in complex with EBOV GP.
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21 **Ebola pseudovirus production and titration**

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23 HIV-1-derived pseudoviruses expressing the Ebola virus envelope glycoproteins (EBOV
24 pseudoparticle, EBOVpp) were produced as described previously.¹⁹ HEK-293T cells were
25 seeded in T175 flasks one day prior to transfection. Cells were transfected with 2 µg pR8ΔEnv,
26 2 µg BlaM-Vpr, 1 µg pcREV and 3µg or 2 µg of plexm-EBOV_GP plasmids (containing Zaire
27 EBOV GP residues 1–676 under control of a β-actin/CMV chimaeric promoter). After 10 hours
28 of transfection, the medium was replaced by fresh DMEM with 10% FBS. Virus containing
29 medium was collected at 48 and 72 hours, and passed through a 0.45 µm filter to isolate the
30 viral particles which were then concentrated using the Lenti-X Concentrator (Clontech). Virus
31 titres were determined by infecting TZM-bl cells (PTA-5659, no mycoplasma contamination)
32 with a serial dilution of concentrated pseudovirus followed by a β-Gal assay. Since the TZM-
33 bl cells contain a β-Gal expression cassette with an HIV-1-induced promoter infected cells can
34 be identified through hydrolysis of X-gal.³¹
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52 **Infectivity assay**

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54 TZM-bl cells were plated 24hours before the assay at 2×10^4 cells per well in black clear-
55 bottomed 96-well plates. On the day of assay, cells were cooled on ice before the addition of
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3 EBOVpp. Viral supernatants were added onto the cells with 1 in 10 dilution, and they were
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5 centrifuged at 2,100xg for 30 minutes at 4 °C. Viral supernatants were removed and cells
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7 washed with 1xPBS. Then, 100 µl of DMEM plus 5% FBS containing toremifene, a well
8
9 characterized ebola fusion inhibitor,¹⁹ **118a** and **118** in a concentration range of 100 µM to
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11 0.125 µM, or no drug, was added to each well before placing in a 37 °C, CO₂ incubator to
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13 initiate viral entry. After 48 hours cells were fixed using 2% PFA for 20 minutes, followed by
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15 a β-Gal assay. Cells were then imaged using a wide-field Olympus microscope equipped with
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17 20 x air objective and transmitted light. All cells in each well were measured and tiled using
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19 Cellsens software (Olympus). The relative number of infected cells versus the total population
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21 of cells was calculated using an automated algorithm (spot tracker) with Icy software
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23 (<http://icy.bioimageanalysis.org/>).

24 25 26 27 28 29 **BlaM assay and analysis.**

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32 The β-lactamase assay^{30, 31} was applied to assess EBOVpp fusion. The procedure was similar
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34 to that used for the infectivity assay, except that TZM-bl cells were plated at 4×10⁴ cells per
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36 well, viral supernatants were added at MOI 0.5 and after removal of virus supernatant and
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38 washing, DMEM plus 10% FBS containing toremifene, **118** or **118a** in a concentration range
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40 of 12 µM to 0.4 µM, or no drug, was added to each well. After 120 min, cells were loaded with
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42 1× CCF2-AM from the LiveBLAzer FRET—B/G Loading Kit (Life Technologies) and
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44 incubated at room temperature in the dark for 2h. After CCF2-AM removal, cells were washed
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46 with 1xPBS and fixed with 2% PFA before viewing. Cells were excited using a 405 nm
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48 continuous laser (Leica) and the emission spectra between 430 and 560 nm were recorded pixel
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50 by pixel (512 × 512) using a Leica SP8 X-SMD microscope with a 20× objective. The ratio of
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52 blue emission (440–480 nm, cleaved CCF2-AM) to green (500–540 nm, uncleaved CCF2-AM)
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54 was then calculated pixel by pixel using a customized macro³⁴ for ImageJ
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56 (<http://imagej.nih.gov/ij/>) with 25 different observation fields for each condition. A blue/green
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3 threshold (fusion threshold) was set using only media. The fusion threshold was calculated
4 recovering the signal (blue/green intensity ratio) coming from individual cells plus $2 \times$ s.d. from
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8 ~300 cells in each observation field using a custom-made macro with ImageJ³⁰. This threshold
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10 was then applied to all conditions. Cells above the threshold were pseudocoloured in red and
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12 cells below the threshold pseudocoloured in blue. 'Red' cells were then compared with blue
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14 cells (non-fusogenic) as an accurate measure of fusion in different conditions.
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18 **Protein expression, purification and crystallization**

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20 The Production of Zaire EBOV (strain Mayinga-76) recombinant glycoprotein extracellular
21 domain has been described previously.^{18,19} In brief, the construct contains residues 32-312 and
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23 464-632 of the GP with mutations T42A and H613A, and a C-terminal tag of a foldon
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25 trimerization sequence from the bacteriophage T4 fibrin and 6 histidines. The construct was
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27 cloned in the mammalian expression vector pNeosec⁴⁴ and then transfected into HEK293T
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29 cells with polyethylenimine and supplemented with 5 μ M kifunensine (Cayman Chemical).
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31 The His-tagged protein from dialysed conditional media was captured with talon beads, treated
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33 with endo- β -acetylglucosaminidase F1 and further purified by size exclusion chromatography.
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35 The resulting protein has 3 amino acids (ETG) from the expression vector pNeosec added at
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37 the N-terminus. Crystallization of EBOV GP was performed using microcrystal seeding and
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39 the sitting-drop vapor diffusion method as described previously.^{18,19} Crystals were grown in
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41 conditions containing 9% (w/v) PEG 6000 and 0.1 M Sodium citrate tribasic dihydrate at pH
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53 **Thermal shift assay**

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55 Thermal shift assays were performed using a Mx3005p qPCR machine following exactly the
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57 method and protocol described previously.^{18,19}
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Crystal soaking, X-ray data collection and structure determination

To obtain GP-inhibitor complexes, the inhibitors were diffused into the GP crystals by soaking. The inhibitors were first dissolved in 100% DMSO and then diluted with a solution containing 15% (w/v) PEG 6000 and 0.1 M sodium citrate (pH 5.2) to concentrations of 5 mg/ml and 2.5 mg/ml. Eight crystals (four for each inhibitor concentration) were soaked for each inhibitor in the above solutions for different lengths of time, ranging from 2 to 20 minutes.

The inhibitor-soaked crystals were mounted in loops and then dipped into cryo protectants containing 75% inhibitor soaking solution and 25% (v/v) glycerol for a couple of seconds before freezing in liquid nitrogen prior to data collection.

All diffraction data were collected at 100 K with a frame size of 0.1° rotation using PILATUS 6M detectors at Diamond Light Source, UK. GP-**118** data were acquired on beamline I24 with a beam size of 50 × 50 μm² and a wavelength of 0.9686 Å. The exposure time per data frame was 0.01 s with 45% beam transmission.^{45, 46} GP-**118a** data were collected on beamline I04-1 with a beam size of 60 × 50 μm² and a wavelength of 0.9282 Å. 360° of data were collected from every crystal that diffracted.

Diffraction images were indexed, integrated and scaled with the automated data processing program Xia2 using the 3dii or Dials protocols.^{47, 48} Data from each crystal were initially phased with rigid-body refinement using the GP-bepridil structure (PDB ID 6F5U) by omitting the inhibitor and water molecules. The electron density maps calculated at this stage were checked carefully. Only those data sets that gave high quality electron density for the soaked inhibitors were used for the later structure refinement. Thus the final data set for GP-**118** to 2.05 Å resolution is from a single crystal, whilst the GP-**118a** complex to 2.3 Å is merged from 5 crystals.

Structure refinement used REFMAC⁵⁴⁹ or PHENIX⁵⁰ and models were rebuilt with COOT.⁵¹

Data collection and structure refinement statistics are given in Table 1. Structural comparisons

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3 used SHP,³⁴ simulated annealing omit electron density maps were calculated with CNS,⁵²
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5 volumes of the drug-binding cavity and drug molecules were calculated with VOLUMES
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7 (Robert Esnouf, unpublished), figures were prepared with PyMOL.⁵³
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10 11 12 **SUPPORTING INFORMATION**

13 14 **SMILES (CSV)**

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17 Figures S1-S3 show the chemical structures of drugs whose structures with EBOV GP have
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19 been reported previously, inhibition of EBOVpp cell entry and comparison of binding modes
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21 of inhibitors that have two molecules bound in the GP cavity. Tables S1 and S2 shows Glide
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23 and QPLD docking scores of known EBOV GP binders and top hits of the *in silico* screening,
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25 respectively. Table S3 gives the coordinates for docked **118** and Table S4 for **118a**.
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30 31 **AUTHOR INFORMATION**

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42 43 **Author Contributions**

44
45
46 # These authors contributed equally to this work. Y.Z., J.R., and D.I.S designed the project.
47
48 F.S. performed *in silico* study, guided by S.W.I.S. Y.Z. and J.R. determined the structures.
49
50 M.I., L.A. and S.P-P. performed inhibitory assay experiments. S. P-P. analysed VLP fusion
51
52 and infection experiments. C.L. and C.S. ascertained structures of the compounds by NMR
53
54 spectrum. J.R., Y.Z. and D.I.S. analysed the results and together with E.E.F. and F.S wrote the
55
56 manuscript. All authors read and approved the manuscript.
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58
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Notes

The authors declare no competing financial interests

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ABBREVIATIONS USED

EBOV, Ebolavirus; EBOVpp, Ebolavirus pseudoparticle; FDA, Food and Drug Administration; GP, glycoprotein; MARV, Marburgvirus; VLP, virus like particle.

Accession Codes

The coordinates and structure factors have been deposited with the RCSB Protein Data Bank under accession codes 6HS4 and 6HRO for GP-118 and GP-118a respectively. The authors will release the atomic coordinates and experimental data upon article publication.

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Figures

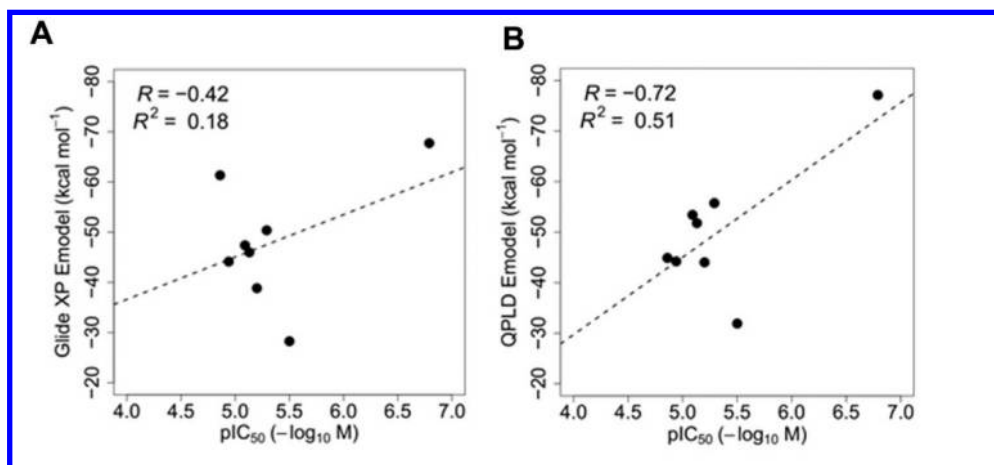


Figure 1. Correlation between docking score and IC_{50} for eight known EBOV GP binders. (A) Plot of Glide XP Emodel against pIC_{50} . (B) Plot of QPLD Emodel against pIC_{50} .

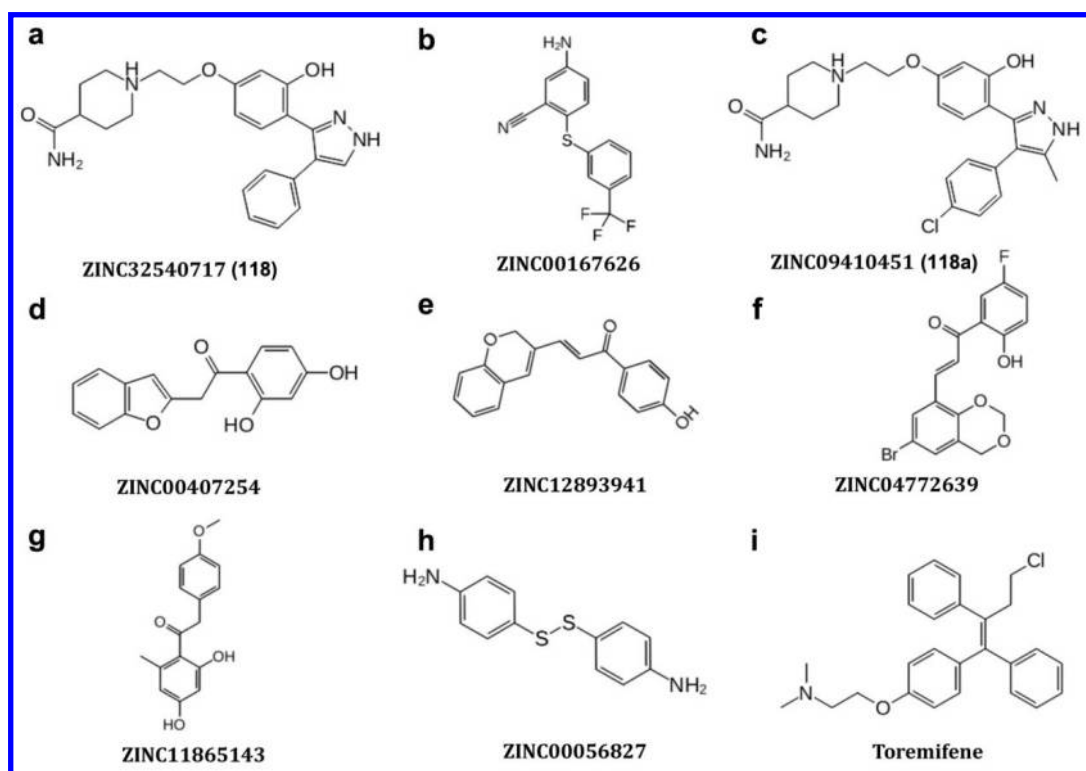


Figure 2. Natural compounds selected from the *in silico* screen results for experimental evaluations. Toremifene is included as a reference. (A) ZINC32540717 (**118**), 1-{2-[3-hydroxy-4-(4-phenyl-1H-pyrazol-3-yl)phenoxy]ethyl}piperidine-4-carboxamide. (B) ZINC00167626, 5-amino-2-{[3-(trifluoromethyl)phenyl]sulfanyl}benzonitrile. (C) ZINC09410451 (**118a**), 1-[2-[(4Z)-4-[4-(4-chlorophenyl)-5-methyl-1,2-dihydropyrazol-3-ylidene]-3-oxocyclohexa-1,5-dien-1-yl]oxyethyl]piperidine-4-carboxamide. (D) ZINC00407254, 2-(1-benzofuran-2-yl)-1-(2,4-dihydroxyphenyl)ethan-1-one. (E) ZINC12893941, (2E)-3-(2H-chromen-3-yl)-1-(4-hydroxyphenyl)prop-2-en-1-one. (F) ZINC04772639, (2E)-3-(6-bromo-2,4-dihydro-1,3-benzodioxin-8-yl)-1-(5-fluoro-2-hydroxyphenyl)prop-2-en-1-one. (G) ZINC11865143, 1-(2,4-dihydroxy-6-methylphenyl)-2-(4-methoxyphenyl)ethan-1-one. (H) ZINC00056827, 4-[(4-aminophenyl)disulfanyl]aniline. (I) Toremifene, 2-[4-[(Z)-4-chloro-1,2-diphenylbut-1-enyl]phenoxy]-N,N-dimethylethanamine.

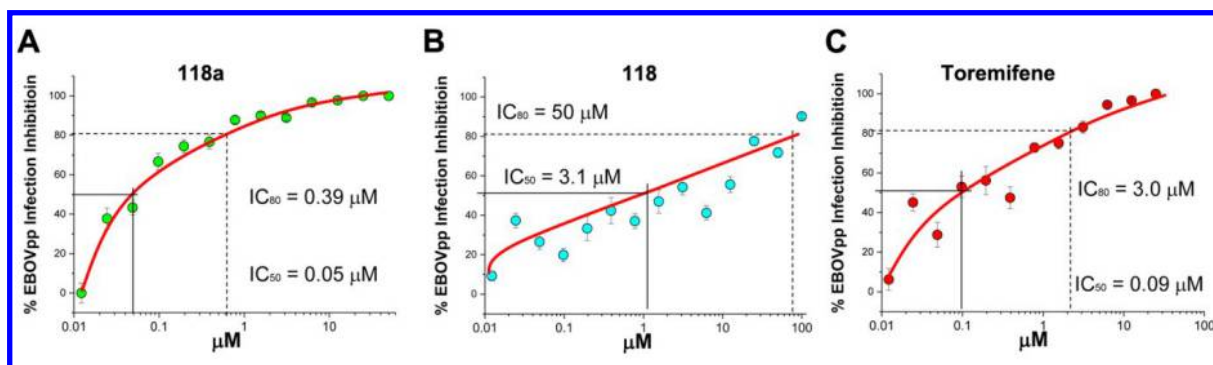


Figure 3. Compound **118a** is a potent inhibitor of EBOVpp infection in live cells. (A to C) Infectivity assays to recover the IC_{50} and IC_{80} with different dilutions for compounds **118a** (A), **118** (B) and toremifene (C) were performed using a β -Gal assay. The percentage of infection inhibition in number of cells per condition is plotted against inhibitor concentration. The error bars show the standard error coming from three independent measurements and the solid lines show a fit using sigmoidal mathematical model. The IC_{50} for **118a** is $0.05 \pm 0.01 \mu M$, $3.1 \pm 0.02 \mu M$ for **118**, and $0.09 \pm 0.08 \mu M$ for toremifene.

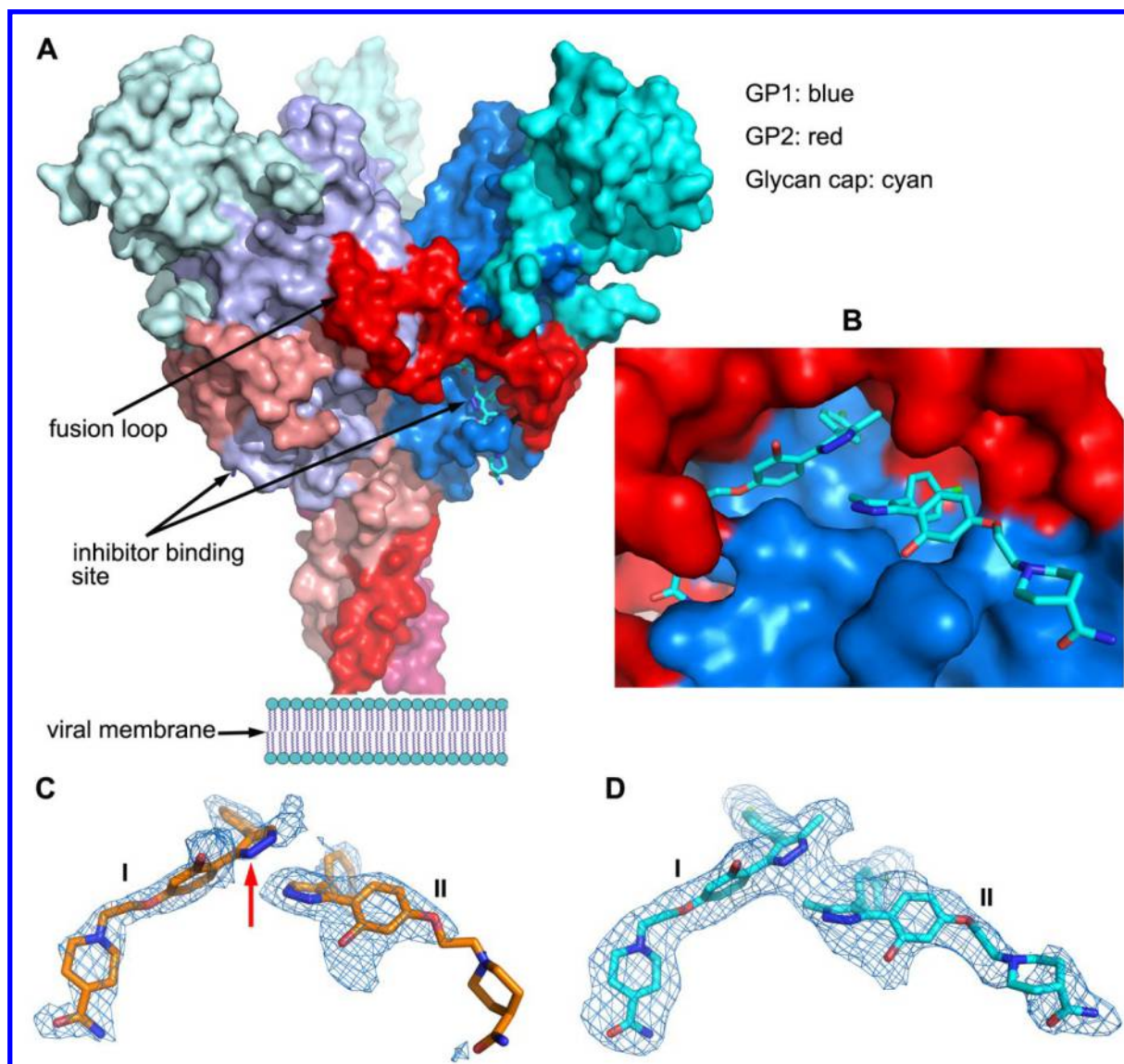


Figure 4. Overall structure of EBOV GP and electron density maps. (A) Surface representation of the trimeric EBOV GP (PDB ID 6HRO). GP1, GP2 and the glycan cap domain are coloured in blue, red and cyan, respectively; for clarity one GP monomer is in bright colour and other two in paler colours. The bound inhibitor **118a** is shown as cyan sticks. (B) Closeup of inhibitor binding site. (C, D) Simulated annealing omit $|F_o - F_c|$ electron density maps contoured at 3σ for bound compound **118** (C) and **118a** (D). In both cases two inhibitor molecules are bound. There is no density for the pyrazole ring (indicated by a red arrow) of **118** molecule I.

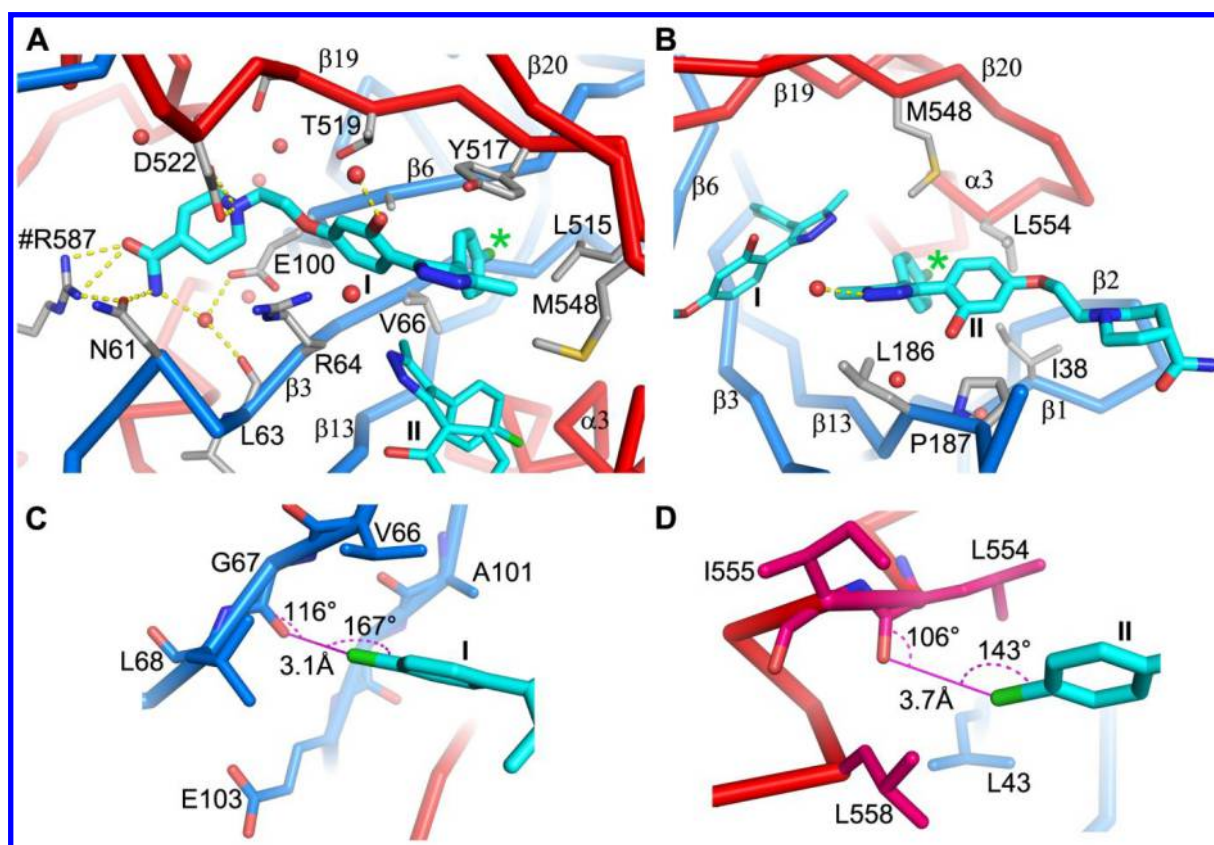


Figure 5 Protein-inhibitor interactions for compound **118a**. (A, B) Molecule I (panel A) and molecule II (panel B) in the binding pocket (PDB ID 6HRO). Protein main chains are drawn as thick blue (GP1) and red (GP2) sticks, the inhibitor as cyan sticks and water molecules as red balls. Protein residues that interact with the inhibitor are shown as grey sticks. Yellow broken sticks represent hydrogen bonds. Residue R587 from a neighbouring monomer is labelled with a # prefix. The position of the chlorine atom is indicated by a green *. (C, D) The environment of the chlorine atoms of molecule I (panel C) and molecule II (panel D). Halogen bonds are shown as magenta lines with bond distances and angles labelled. Protein residues are drawn as blue (GP1) and red (GP2) sticks.

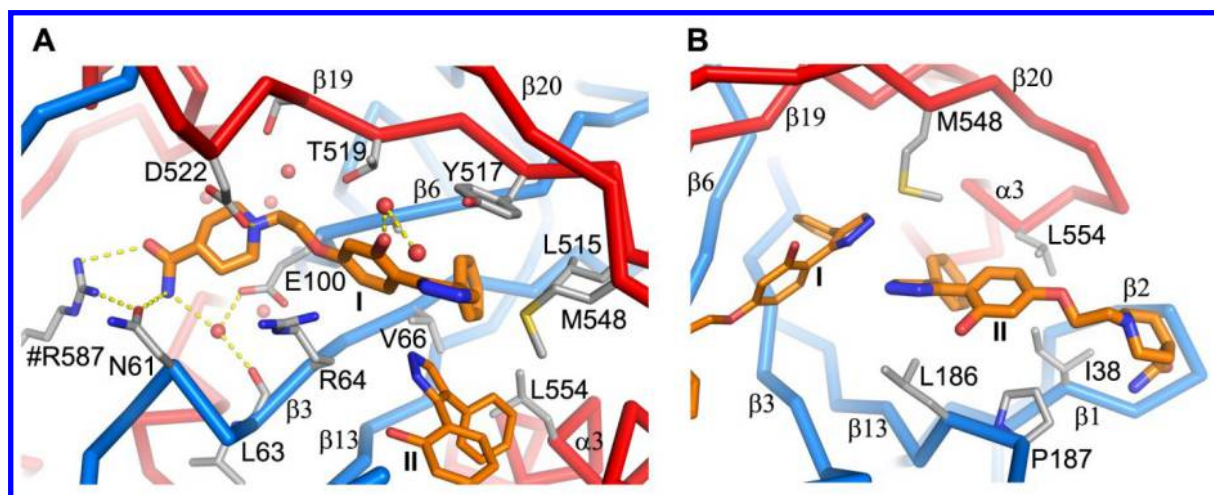


Figure 6. Protein-inhibitor interactions for compound **118**. (A, B) Molecule I (panel A) and molecule II (panel B) in the binding pocket (PDB ID 6HS4). Protein chains, water molecules and hydrogen-bonds are shown as in Figure 5, compound **118** is drawn as orange sticks.

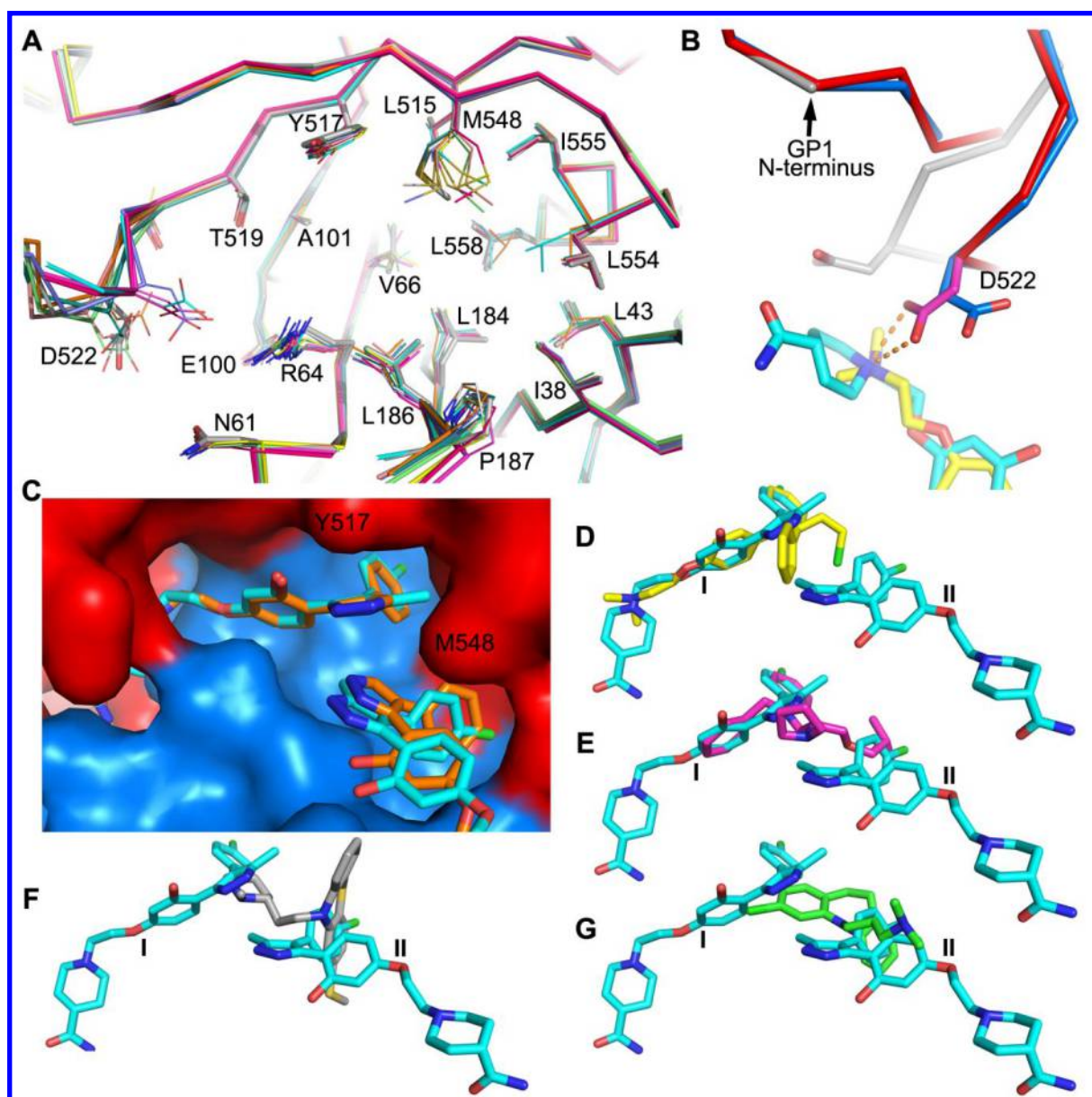


Figure 7. Protein structural changes and binding modes of different inhibitors. (A) Structural differences at the inhibitor-binding site of apo GP and 10 GP-inhibitor complexes. Superimpositions were done using the whole GP, the apo structure is shown as thicker grey sticks and inhibitor bound structures as thinner sticks. (B) The piperidine carboxamide group of **118a** (red and cyan, PDB ID 6HRO) and the dimethylethanamine group of toremifene (blue and yellow, PDB ID 5JQ7) introduced structural changes at the N-terminus of the fusion loop compared to the apo GP (grey). The bifurcated hydrogen-bonds from D522 to the nitrogen atom of the piperidine ring are shown as broken sticks. (C) Comparison of the binding mode

of **118** (orange sticks, PDB ID 6HS4) and **118a** (cyan sticks, PDB ID 6HRO) in the cavity. (D to G) Comparison of binding pose of **118a** with toremifene (D), bepridil (E, PDB ID 6F5U), thioridazine (F, PDB ID 6G95) and clomipramine (G, PDB ID 6G9I).

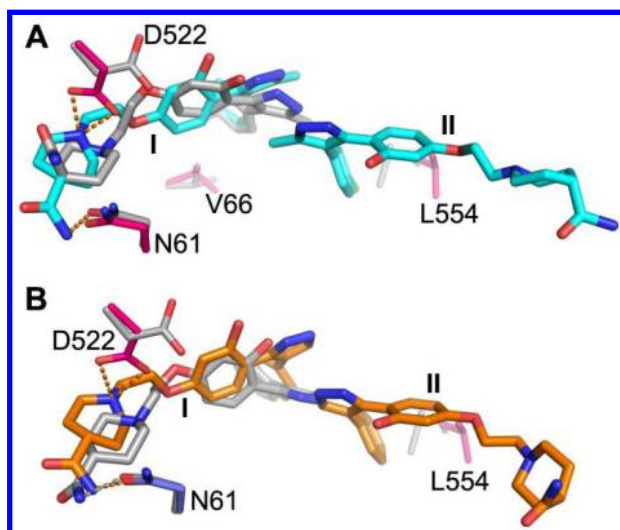
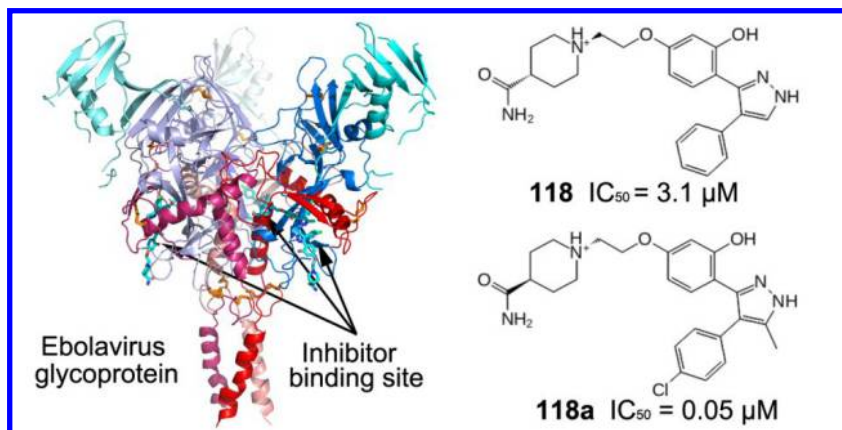


Figure 8. Comparison of crystal structure and the docked pose. (A) The docked pose of compound **118a** is overlaid with the crystal structure of GP-**118a**. **118a** in the crystal structure is shown in cyan and in grey for the docked pose; protein side-chains that have large conformational differences or hydrogen bond to the inhibitor are shown as blue (GP1) and red (GP2) sticks for the crystal structure, and grey sticks for the structure used in docking. (B) Comparing the docked pose of compound **118** (grey sticks) with the bound mode in the crystal structure (orange sticks). Protein side-chains are coloured as in (A). The orange broken bonds represent hydrogen bonds.

Table 1. Data collection and refinement statistics

	GP-118	GP-118a
Data collection		
Space group	<i>R</i> 32	
Cell dimensions		
<i>a, b, c</i> (Å)	114.2, 114.2, 305.4	115.1, 115.1, 307.9
α, β, γ (°)	90, 90, 120	90, 90, 120
Resolution (Å)	57.1–2.05 (2.09–2.05)*	83.8–2.30 (2.34–2.30)
<i>R</i> _{merge}	0.063 (---)	0.098 (---)
<i>I</i> / σ <i>I</i>	21.1 (1.1)	36.5 (1.4)
Completeness (%)	98.4(90.4)	100 (99.9)
Redundancy	15.8 (6.0)	91.0 (16.8)
<i>CC</i> _{1/2}	1.0(0.44)	1.0(0.75)
Refinement		
Resolution (Å)	57.1–2.05	83.8–2.30
No. reflections	32976/1758	33711/1696
<i>R</i> _{work} / <i>R</i> _{free}	0.191/0.221	0.180/0.211
No. atoms		
Protein	3045	3029
Ligand/glycan/ion	213	223
Water	165	143
Mean B-factors		
Protein	66	92
Ligand/glycan/ion	104	134
Water	54	77
R.m.s. deviations		
Bond lengths (Å)	0.005	0.003
Bond angles (°)	0.8	0.7

*Values in parentheses are for highest-resolution shell.



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