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# **Exploiting Structural Analysis,** *In Silico* **Screening and Serendipity to Identify Novel Inhibitors of Drug-resistant Falciparum Malaria**

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# **Abstract**

*Plasmodium falciparum* thymidylate synthase-dihydrofolate reductase (TS-DHFR) is an essential enzyme in folate biosynthesis, and a major malarial drug target. Point mutations in *P. falciparum* TS-DHFR have caused widespread global antifolate resistance, and yet the most effective antifolate known to overcome drug-resistance, WR99210, has poor oral bioavailability. More specific, less toxic therapies are urgently needed. Antifolates target the conversion of methylene tetrahydrofolate to dihydrofolate by TS, and that of dihydrofolate to tetrahydrofolate by DHFR. In humans, TS and DHFR are two discrete enzymes. In *P. falciparum*, however, TS-DHFR is a bifunctional enzyme, with TS and DHFR encoded within a single protein, and tethered together with by a 'linker' region. This linker is not homologous to any other known TS or DHFR enzymes, and is essential for enzyme activity. This bifunctional enzyme thus presents different design approaches for developing novel inhibitors against drug-resistant mutants: developing active-site inhibitors equally effective against wildtype and drug-resistant parasites, or targeting unique non-active site regions for parasite-specific inhibitors. As a first step in identifying unique inhibitors, we performed a high-throughput *in silico* screen of a database of diverse, drug-like molecules against a non-active site pocket within the linker region of TS-DHFR. The top compounds from the virtual screen were evaluated by enzymatic and cellular assays. *In vitro* enzymatic studies and cell culture studies of wildtype and drug-resistant *P. falciparum* parasites identified three compounds active to 20 μM IC<sub>50</sub>s in both wildtype and antifolate-resistant enzymatic studies, as well as in *P. falciparum* cell culture. Moreover no inhibition of human DHFR enzyme was observed indicating the inhibitory effects appeared to be parasitespecific. Notably, all three compounds had a biguanide scaffold. Further computational analysis was utilized to determine the relative free energy of binding and these calculations suggested that the compounds might preferentially interact with the active site over the screened 'linker' region. To resolve the two possible modes of binding, co-crystallization studies of the compounds complexed with TS-DHFR enzyme were performed to determine the three-dimensional structures. Surprisingly, the structural analysis revealed that these novel, biguanide compounds, distinct from WR99210, do indeed bind at the active site of DHFR, and additionally revealed the molecular basis by which they overcome drug-resistance. To our knowledge, these are the first co-crystal structures of novel,

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biguanide, non-WR99210 compounds that are active against folate-resistant malaria parasites in cell culture. These studies reveal how serendipity coupled with computational and structural analysis can identify unique compounds as a promising starting point for rational drug design to combat drugresistant malaria.

#### **Keywords**

Dihydrofolate reductase-thymidylate synthase (DHFR-TS); *Plasmodium falciparum*; antifolate; anti-malarial; biguanide; molecular docking

# **INTRODUCTION**

Malaria is an infectious disease caused by *Plasmodium* spp parasites, and remains an epidemic of sweeping socioeconomic consequence in tropical countries (2). Between 1 and 3 million lives are lost annually, and over 40% of the world's population is at risk of contracting malaria, with some 350 million new infections each year (2). Notably, *P. falciparum* infections account for over 90% of malaria-related mortality (2). The last decade has seen a 25% increase in mortality from malaria in Africa alone, due in large part to a rise in drug-resistant parasites (2).

The history of malaria treatment is one of acquired drug resistance and toxic side effects. There is known, widespread resistance to chloroquine, mefloquine, atovaquone, proguanil and pyrimethamine  $(3<sup>-5</sup>)$ . Artemisinin compounds, developed from ancient Chinese herbals, are the only antimalarials to which known resistance has not yet been identified (3). With the introduction of each new antimalarial drug, resistance has emerged more quickly than with the last  $(2, 6, 7)$ . Novel, less toxic, more specific, nonartemisinin treatments are urgently needed to curb this global epidemic (2).

Antifolates like pyrimethamine and cycloguanil are active-site inhibitors of the malarial dihydrofolate reductase (DHFR) enzyme, and have been used successfully to treat falciparum malaria (3). They prevent the conversion of dihydrofolate ( $H_2$ -folate) to tetrahydrofolate ( $H_4$ folate) by DHFR (3). Interestingly, unlike in humans where TS and DHFR are encoded as two discrete enzymes, the malarial DHFR is encoded on the same polypeptide chain as the thymidylate synthase (TS) enzyme (which catalyzes the upstream reaction of converting methylene tetrahydrofolate (CH<sub>2</sub>H<sub>4</sub>-folate to H<sub>2</sub>-folate). This bifunctional TS-DHFR enzyme is the target of antifolate drug design in *P. falciparum (8)*.

Although resistance to antifolates in *P. falciparum* emerged soon after their introduction, pyrimethamine continues to be used today, in combination therapy with sulfadoxine (sulfadoxine-pyrimethamine or SP, trade name Fansidar™) for malaria prophylaxis in pregnant women (9). In addition, SP combined with amiodaquine or artesenuate remains the first-line therapy for uncomplicated *P. falciparum* malaria in many parts of sub-Saharan Africa (5). It should be noted that the competitive inhibitors of *P. falciparum* DHFR like pyrimethamine are routinely used in combination therapy (5).

Antifolate resistance in *P. falciparum* TS-DHFR is caused by point mutations in the DHFR active site (10). The first mutation to occur is S108N, followed by C59R, then N51I, and finally I164L; each subsequent mutation progressively decreases the binding of both  $H_2$ -folate (the natural substrate) and pyrimethamine, due to structural changes in the DHFR active site (8). The K<sup>i</sup> 's for pyrimethamine for the double mutant C59R/S108N and N51I/C59R/S108N/I164L DHFR are 50-fold and >500-fold, respectively, less inhibitory than WT (1.5 nM) (11). Note that these K<sub>i</sub>'s are only for the monofunctional *P. falciparum* DHFR enzyme and reaction.

Pyrimethamine-resistant DHFR mutations are found throughout West and Central Africa and Asia (5).

Several attempts have been made to develop novel antifolates which bind to the active site of the clinically important, quadruple mutant of *P. falciparum* TS-DHFR. One of these, the dihydrotriazene WR99210 (Figure 1a), has a sub-nanomolar  $K_i$  value for the WT, double mutant and quadruple mutant DHFRs (8). Structural studies have demonstrated that WR99210 is highly effective against the quadruple mutant because it lacks the *p*-chlorophenyl moiety of antifolates like pyrimethamine, and has a flexible linker, both of which enable it to avoid steric clash with Asn 108 (8). WR99210 is also bound within the 'substrate space' – the essential space within the active site which cannot undergo major conformational rearrangements if H2-folate binding (and thus catalytic activity) are to be preserved (8) (Figure 1b). Unfortunately, the poor oral bioavailability of WR99210 prevents its clinical use (12). To develop novel *P. falciparum* DHFR active-site inhibitors, molecular docking studies using derivatives of WR99210 (13) or pyrimethamine (14) are underway in some laboratories (15). There have also been reports of molecular docking studies using homology models of *P. falciparum* DHFR (16).

The bifunctional malarial TS-DHFR enzyme has non-active regions which both flank and tether these two active sites together, and which have no homology to the human TS and DHFR enzymes (17). As *In vitro* kinetic studies have shown, the non-active site regions of parasitic TS-DHFR enzymes can play a significant role in modulating catalysis (17). In the malaria enzyme specifically, E. coli complementation studies with the *P. falciparum* TS and DHFR enzymes have also suggested an important role for these distant structural regions  $(18, 19)$ .

The structural and kinetic properties of *P. falciparum* TS-DHFR therefore suggest different approaches towards novel inhibitor design. One method would involve developing new activesite inhibitors that are equally effective against WT and drug-resistant parasites. A second method would target the non-active site regions, which have no homology to the human host. To our knowledge, however, no current efforts are focused on the development of novel, non-WR99210 scaffolds, or on the extensive non-active site regions of *P. falciparum* TS-DHFR, to develop novel, parasite-specific antifolates.

The 89 aa-long linker (from residues 232 to 320) in *P. falciparum* TS-DHFR encodes significant secondary structure and at least an RNA-binding site (20), and complementation studies suggest a role for this junctional region in modulating activity and association between the TS and DHFR domains  $(18, 19)$ . Therefore, the linker could serve as an interesting target for molecular docking and virtual screening studies for a potential novel, non-active-site inhibitor of *P. falciparum* TS-DHFR.

In this study, we performed virtual screening studies of the Maybridge Hitfinder™ library of diverse, drug-like compounds (21), that could bind with moderate (mid-micromolar) affinity to a non-active site pocket within the linker region of *P. falciparum* TS-DHFR. While previous molecular docking studies have been reported on a homology model of the *P. falciparum* DHFR  $(16, 22, 23)$  before the three-dimensional structure was available, our study involves a virtual screen of the completed crystal structure of the *P. falciparum* bifunctional TS-DHFR enzyme. Using *in vitro* enzyme screening, as well as malarial cell culture studies, we identified three lead compounds with similar activity against WT and antifolate-resistant *P. falciparum* parasites in culture. Significantly, these three compounds had non-WR99210 scaffolds and further computational analysis was used to evaluate their interaction with non-active site pocket as well as the DHFR active site. Using computational analysis, virtual free energy of binding calculations predicted that these lead compounds would preferentially interact with the DHFR active site, instead of the linker region screened by molecular docking. Structural studies were

carried out to obtain the structure of the inhibitors bound to the bifunctional *P. falciparum* TS-DHFR enzyme and distinguish between the two plausible sites for inhibitor binding. Serendipity played a role since co-crystallography studies confirmed that these lead inhibitors bound to the DHFR active site for WT and drug-resistant TS-DHFR enzyme rather than the non-active pocket initially targeted by virtual screening. These structural studies also revealed the molecular mechanism for the compounds interaction with the quadruple, drug-resistant form of the TS-DHFR enzyme and offers a new avenue to exploit for future development of targeted, structure-guided antimalarial therapy.

# **RESULTS and DISCUSSION**

We describe the identification a novel biguanide scaffold that is active in cell culture against the clinically important, antifolate-resistant mutant of *P. falciparum* TS-DHFR. Using enzymatic and cell culture assays to screen the 'hits' from our molecular docking studies, we identified three compounds, RJF 001302, RJF 00670, and RJF 00719, with around 20 μM inhibition in *P. falciparum* pyrimethamine-resistant DHFR enzyme in *in vitro* kinetic studies. Our data also showed these compounds to be active in both WT and quadruple mutant *P. falciparum* cell culture. As kinetic studies regarding the pattern of inhibition were inconclusive, and the compounds had a biguanide moiety somewhat akin to WR99210 (a known competitive inhibitor of *P. falciparum* DHFR), we pursued free energy of binding calculations using MM-GB/SA (molecular mechanics and the generalized Born model and solvent accessibility) (24). These results suggested that all three compounds preferred to bind to the DHFR active site, compared to the non-active site pocket which was originally targeted. Since we could not decisively assign the RJF compounds as non-active-site inhibitors, we proceeded with structural studies of these inhibitors complexed with *P. falciparum* TS-DHFR enzyme for definitive determination of the mode of binding. Interestingly, despite our virtual screening data, co-crystallization studies of inhibitor complexed with the WT and pyrimethamineresistant, quadruple mutant enzymes confirmed that these compounds do indeed bind to DHFR active site. Importantly, however, the RJF compounds avoid steric clash with Asn108, a key residue that hinders existing antifolates like pyrimethamine from binding the drug-resistant mutant enzymes. Also, several key interactions between inhibitor and the DHFR active site, shown previously to be essential in successful antifolates like WR99210 or pyrimethamine (8), are retained by the RJF compounds, even in the quadruple mutant enzyme. Each of these points is elaborated upon below.

#### *Virtual Screening of a Non-active Site Pocket in* **P. falciparum** *TS-DHFR*

We screened 16,000 compounds from the Maybridge HitFinder™ library against the crystal structure of WT *P. falciparum* TS-DHFR using Glide SP (Supplementary Figure 1). The top fourteen compounds identified by this screen are shown in Supplementary Table 1, with their corresponding Glide scores and chemical structures, and a summary flowchart of the screening process is provided in Supplementary Figure 2. Overlaying the 'top hit' compounds in the crossover region showed that the ligands had different binding modes, implying that they occupy one of several 'spaces' within the non-active site pocket (Figure 2). These inhibitors were characterized with QikProp and showed favorable predicted ADME properties (25) (Supplementary Table 2).

The Maybridge HitFinder™ compound database was screened because it comprises the chemical diversity of the entire Maybridge compound library, prescreens the compounds for Lipinski rules (26), and is commercially available to over 90% purity (21). The Glide SP score is a soft scoring function used to identify ligands likely to bind to a target protein, thereby minimizing false negatives. The most heavily weighted items in determining the Glide score are van der Waals interactions and lipophilic contact, and compounds with lower scores are

predicted to bind more tightly to the target protein. Scores ranged from −9.32 to −8.50, which is within the normal range of expected scores for moderate affinity (mid-micromolar) compounds from Glide SP (27).

Since this was an initial attempt at small molecule binding in the non-active site pocket, we set a large boundary condition (Supplementary Figure 1), and favored results with diversity in shape and binding mode of the inhibitor (Figure 2). QikProp was used to check important physical properties of the top 'hits' from this screening, as it predicts log P, log S and Caco-2 (physical properties useful in inhibitor optimization in the drug design process). Compounds with molecular weight less than 450, logP less than 5, log S greater than −5 and pCaco greater than 25 are considered to have favorable lead-compound like properties (25).

Virtual screening methods have limitations due to approximations used in the scoring function, as well as measures taken to simplify the conformational search space to reduce computation time for the thousands of screened compounds (28). Another limitation of this virtual screening study was the molecular docking of a predicted doubly charged biguanide moiety in the screened compounds, although experimental evidence suggests that these biguanides are monoprotonated at physiological pH  $(29, 30)$ . Furthermore, kinetic evidence suggests that the current crystal structure of WT *P. falciparum* TS-DHFR may not be in its most active conformation as the TS active site is not doubly liganded (17). As this was the initial virtual screening of the non-active site pocket, these molecular docking studies were done with minimal experimental evidence about which residues in the non-active site are functionally important, or how protein conformation would adjust to inhibitor binding at the non-active site.

#### **In Vitro** *Enzymatic Assays of Inhibitor Assay*

Using a spectrophotometric assay, which follows the consumption of NADPH at 340 nm, we screened the 'hits' for inhibition of the bifunctional TS-DHFR and DHFR activities. Several compounds exhibited intrinsic absorbance or display signal attenuation at 340 nm, and the activity of these compounds was further examined under steady-state conditions using radiolabeled assay for bifunctional TS-DHFR and DHFR activity. A number of 'hits' also precipitated in buffer conditions, even in high/low salt conditions and in very acidic or very basic pH's, and those compounds insoluble in reaction buffer were excluded from the analysis.

The compounds were initially screened for inhibition of the bifunctional TS-DHFR reaction using both a spectrophotometric and a radiolabeled assay. As the radiolabeled assay showed a buildup of H<sub>2</sub>-folate in the reaction products at early time points for RJF 01302, we also screened these compounds for DHFR activity in the bifunctional enzyme. Of the top fourteen compounds tested, we found three active compounds to inhibit the DHFR reaction in the bifunctional enzyme – RJF 00670, RJF 01302 and RJF 00719. They did not inhibit the human DHFR enzyme at 500 μmol/L concentrations. Kinetic studies to determine a pattern of inhibition (competitive or non-competitive) in the bifunctional enzyme using both a radiolabeled and spectrophotometric assay were somewhat inconclusive.

This combination of these analyses identified three compounds of interest, all of which inhibited DHFR (but not TS) activity in the WT bifunctional TS-DHFR enzyme. Due to difficulties with expressing sufficient quantities of the full-length, bifunctional quadruple mutant (N51I/C59R/S108N/I164L) *P. falciparum* TS-DHFR enzyme, we used monofunctional constructs of *P. falciparum* WT and quadruple mutant DHFR for further *in vitro* enzyme assays to determine an accurate, comparative  $IC_{50}$  for the DHFR reaction in WT and quadruple mutant enzymes. These results are summarized in Table 1, and the corresponding curves shown in Supplementary Figure 3.

Interestingly, all three of these compounds - RJF 01302, RJF 00670, and RJF 00719 (see Footnote <sup>2</sup>) – contain a biguanide scaffold. The IC<sub>50</sub> of these compounds was ∼ 500 µM for the bifunctional reaction predominately reflecting the TS reaction, but ∼20 μM for the DHFR reaction, as determined by spectrophotometric assays. It is of note that other compounds containing a biguanide scaffold (see Supplementary Table 1) were not inhibitory: in some of these cases, solubility was limiting (RJF 00587, RJF 00729), but in other cases, the lack of inhibitory effect is puzzling (RJF 00600). RJF 01059 had weak activity against the DHFR (but not bifunctional TS-DHFR reaction), and was therefore not pursued for further analysis. We also tested biguanides (RDR 01651, RJF 00541 and RDR 003335) which were not identified by the Glide screen, but that were Maybridge HitFinder™ compounds related to RJF 01302. None of these latter compounds were active in *in vitro* enzymatic assays (data not shown).

Excitingly, when RJF 00719, RJF 00670 and RJF 01302 were assayed for their activity in the monofunctional construct of *P. falciparum* DHFR, they showed similar inhibition in both WT enzyme, and the strongly pyrimethamine-resistant quadruple mutants of the enzyme.

Although an obvious limitation of the  $IC_{50}$  determination was that we assayed for activity using a monofunctional DHFR enzyme, the comparative results are valid as both the WT and quadruple mutant enzyme were monofunctional in this assay, and determining inhibitor activity using a monofunctional DHFR enzyme is a well-accepted, standard assay in the *P. falciparum* antifolate literature (31). While standard steady-state competition assays performed using the spectrophotometric assay suggested these compounds had a non-competitive pattern of inhibition, these data were obviously limited by the inherent absorbance of the compounds at 340 nm, as well as the signal attenuation described above. Therefore, free energy of binding calculations were pursued to predict whether the RJF compounds preferred the DHFR active site to the non-active site pocket in the linker region (see below).

#### **Cell Culture Assays of Inhibitor Activity**

To determine activity in both WT and antifolate-resistant cell culture, the three RJF compounds were assayed for activity in *P. falciparum* parasites with either WT DHFR enzyme (TM4/8.2) or the quadruple mutant DHFR enzyme (V1/S or N51I/C59R/S108N/I164L). The *P. falciparum* parasite cell culture (TM4/8.2 and V1/S, respectively) in the erythrocytic stage of the life cycle was performed using a standard  $[{}^{3}H]$ -hypoxanthine incorporation assay (32).

The compounds demonstrated similar activity in both WT and quadruple mutant parasites in the erythrocytic stages (Table 1). The higher  $IC_{50}$  of RJF 00670 in cell culture could possibly be explained by degradation or metabolic instability. More importantly, the fact that the  $IC_{50}$ 's were relatively similar for the DHFR monofunctional enzyme and cell culture assays for two of the three compounds suggested that DHFR might indeed be the major target of the RJF compounds.

Inhibition of parasite replication during erythrocytic stages is an important indicator of activity, since the majority of *P. falciparum* parasites in an infected human host reside within the erythrocyte. It is intra-erythrocytic replication and subsequent extravasation of erythrocytes which causes the fevers, chills, anemia, and secondary organ damage characteristic of falciparum malaria (33). However, inhibition of the liver stages (sporozoite phase) by the RJF compounds, as well as their oral bioavailability and toxicology, must be further examined in animal models of malaria (like *P. bergheii*). Evaluation of inhibition of the sporozoite phase of this parasite are important for determining the use of these lead compounds for malaria prophylaxis (34).

<sup>&</sup>lt;sup>2</sup>The RJF compounds were developed in the chemistry laboratory of Ray J. Froude at Maybridge (now Thermofisher Scientific, Tintagel) in the early 1980's. They were originally produced as intermediates en route to synthesizing aminotriazenes, and later developed into a "series" of drug-like molecules (1).

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#### **Evaluation of the Relative Free Energy of Binding to determine the Preferred Binding Site for RJF Compounds**

To investigate whether that these lead compounds were binding at the non-active site pocket or the DHFR active site, relative free energies of binding were calculated based on their Glide poses. WR99210, the ligand from the crystal structure used in the docking studies (PDB id 1j3i), was used as a control. The relative free energies of binding ( $\Delta\Delta$  G bindactive site – nonactive site) for WR99210, RJF 01302, RJF 00670, and RJF 00719 were −33, −31, −56 and −22 kcal/mol, respectively. These computational data indicated that WR99210 and the RJF compounds all preferred binding the DHFR active site over the non-active site pocket in the linker region (Figure 3).

Conventional docking studies could not be used to compare these binding energies, given the 45 Å distance between the sites. MM-GB/SA methods to estimate approximate relative free energies of binding are considered an efficient way to post process compounds after highthroughput, virtual screening, avoiding more time-consuming free energy simulations (24). Traditionally, energies are used relatively in one site, comparing multiple ligands. Here, multiple sites for individual ligands were examined, to determine specificity rather than to find a top lead. Known DHFR active-site inhibitor WR99210 was used as a control, as the calculations should indicate that it prefers binding the DHFR active site. In this case, trends are more important than magnitudes, due to necessary approximations made due to the distance between the two sites (around 45 Å) and the size of the bifunctional homodimer. While MM-GBSA methods tend to quantitatively overestimate binding free energies (35), the calculations provide a qualitative indication that the RJF compounds (as well as the known DHFR activesite inhibitor control, WR99210), prefer binding the active site of *P. falciparum* DHFR. The RJF compounds likely ranked high in the original screen of the non-active site pocket in the linker region because of their charged (protonated) states, and the multiple charged residues at both the DHFR active site and the non-active site pocket (Figure 2).

#### *Co-crystallization of Inhibitors with* **P. falciparum** *WT and Quadruple Mutant TS-DHFR*

However, given that computational methods suggested that the DHFR active site was the target site, structural studies were pursued. We were able to co-crystallize the inhibitor RJF 00670 with the full-length, bifunctional, quadruple mutant of *P. falciparum* TS-DHFR to 2.56 Å resolution (PDB ID: 3DG8; Figure 4a), and RJF 01302 with the WT enzyme to 2.70 Å resolution (PDB ID: 3DGA, Figure 4b). We were also able to crystallize the co-complex of TS-DHFR with RJF 00719, but unfortunately could not see enough of the electron density to report the complete co-complex structure. This is likely due in part to solubility limitations with RJF00719, indicating perhaps that the binding site was not completely saturated.

Both RJF01302 and RJF00670 co-crystallized at the active site of the DHFR enzyme, indicating that virtual free energy of binding studies, which predicted binding of RJF compounds at the DHFR active site, corresponded well with the crystallography data (Figure 3). The complete electron density of both ligands was observed, despite the relatively high B factors. The protein-ligand interactions formed between the active site residues of DHFR and the inhibitors were calculated using LigPlot and are shown in Supplementary Table 3. We also performed an analysis of the common interactions formed between WR99210 and the quadruple mutant DHFR, as well as between pyrimethamine and the WT DHFR, and compared these interactions to those formed by the RJF compounds. These interactions are summarized in Supplementary Table 3 and their implications are discussed below. Data collection and refinement statistics are shown in Table 2, and Fo-Fc maps are shown in Supplementary Figures 4 and 5.

While these results were unanticipated by our initial virtual screening studies of the linker region, a low-micromolar, novel scaffold which binds to the DHFR active site of, and have activity in, both WT and quadruple mutant *P. falciparum* TS-DHFR remains an important finding. When the co-crystal structures of RJF 00670 and RJF 01302 are superimposed (Figure 4c), and the hydrophobic, van der Waals and H-bond interactions formed between inhibitor and DHFR active site are examined closely, several interesting observations are made.

First, and most importantly, both RJF 00670 and RJF 01302 are not sterically hindered by Asn 108, the point mutation essential to pyrimethamine resistance. (RJF 01302 was co-crystallized with the WT enzyme, and this was determined by aligning this structure to the active site of the quadruple mutant.) That the RJF compounds also avoid this steric clash - just as WR99210 but unlike pyrimethamine -, suggests a common mechanism for overcoming antifolate resistance in malarial DHFR, and is encouraging with respect to their potential as promising antifolate scaffolds for further lead optimization (Figure 5).

Second, in the antifolate inhibitor literature on *P. falciparum* TS-DHFR, there has been much analysis to discern the interactions that are essential between enzyme and inhibitor. In addition to Ser 108, another such important residue (which lies at the opposite ends of the hydrophobic substrate space) that interacts with WR99210 and pyrimethamine is Asp 54 (on  $\alpha$  helix B) (8). Chemically, the RJF compounds vary from WR99210 by lacking a cyclic guanidinium ring and the dimethyl group. Despite that, both RJF 00670 and RJF 01302 form hydrogen bonds with the carboxyl side chain of Asp 54 and the backbone carbonyl of Ile 164 (another common mutation in the quadruple mutant of pyrimethamine-resistant DHFR). Furthermore, as shown in Supplementary Table 3, the RJF compounds also make polar interactions with Ile14, Tyr170, and Cys15, and van der Waals contact with residues Phe58, Ile112, Leu119, Met 55, Cys15 and Ala16 at the DHFR active site. Despite being about 100 g/mol smaller in molecular weight than WR99210, the RJF compounds thus form many of the same interactions considered to make WR99210 and the pterin ring of the natural substrate  $H_2F$  bind so tightly and specifically within the substrate space of the quadruple mutant DHFR.

A third critical observation is that the aromatic ring of the RJF compounds forms very few interactions with the residues of the active site (Figure 4a and b). This finding reaffirms the usefulness of the RJF series as potential lead compounds since functional groups can be added easily to this ring, especially in a position meta- or para- to the bisimine.

#### *Do these inhibitors specifically target* **P. falciparum** *DHFR?*

Several lines of evidence suggest that *P. falciparum* DHFR is at least one of the primary targets of the RJF compounds. First, the  $IC_{50}$  in cell culture and in enzyme assays are approximately equivalent, suggesting that DHFR may be the primary target of these inhibitors. Also, these compounds co-crystallize at the active site of both WT and quadruple-mutant *P. falciparum* DHFR. Though the RJF series are small lead compounds, it should be noted that the human DHFR enzyme is not inhibited by these compounds at 500 μmol/L concentrations. "Folate effect" studies are often used for to demonstrate folate pathway inhibition by sulfa drugs. However, the utility of similar folate antagonism studies remains unclear for target validation of DHFR inhibitors in *P. falciparum*, given the complexities of folate salvage and catabolism pathways in the *Plasmodium* parasite, and the tremendous folate reserve of *Plasmodium* parasites even after several reinvasions (36). For example, folate can be cleaved to pterin-6 aldehyde and p-amino-benzoylglutamate, byproducts utilized in folate biosynthesis, while exogenous intact folates are also alternatively be salvaged and utilized by the parasite (37, 38). *P. falciparum* may have putative folate transporters, whose candidate genes, MAL8P1.13 and PF11\_0172, we have previously identified (39). For example, folic acid and folinic acid could not be used to reverse the effect of even pyrimethamine in *P. knowlesi* (40) and of WR99210 in *P. falciparum*, though the refractory effect depended on the strain and

experimental approach used  $(41<sup>-43</sup>)$ . Consequently, experiments using the "folate effect" to validate targets of inhibition such as DHFR are often difficult to interpret for the purpose of drawing definitive conclusions.

#### **Summary and Implications for Potential Novel Antifolates based on the RJF Scaffold**

Biguanides are routinely used clinically and are recognized as safe, well-tolerated and highly effective anti-diabetic therapy agents (44). Additionally, guanidines have been implicated before in the development of *E. coli* DHFR inhibitors  $(45, \frac{46}{9})$ , and at least one cyclic biguanide has been shown to have anti-Plasmodial activity at 10 μmol/L when tested in the wildtype 3d7 strain (47). However, this is the first report of guanidine scaffolds co-crystallized with a drugresistant mutant of the malarial TS-DHFR enzyme. Our data both demonstrate that RJF compounds have similar activity in cell culture in both WT and antifolate-resistant parasites, and potentially suggest a common mechanism for how antifolates overcome drug resistance in malarial DHFR. Furthermore, these co-crystal structures can enable structure-guided development of novel inhibitors that maximize key active site interactions by the addition of functional groups to the RJF scaffold. Future directions will focus on testing these inhibitors in human cell culture, as well as developing subtractive *in silico* filters to select non-active inhibitors that do not bind the DHFR active site.

In the face of growing mortality, new antimalarials are urgently needed. RJF compounds therefore hold the exciting potential of serving as novel scaffolds for development of targeted, structure-guided antimalarial therapy.

# **METHODS**

Additional details for each section are available in Supplementary Methods.

#### **Molecular Docking Studies**

With close examination of the linker region in the structure of *P. falciparum* TS-DHFR (PDB structural ID: 1j3i), we identified a pocket within the linker region defined by contributing residues from the linker, DHFR and TS domains, with the rationale that binding of a small molecule to this linker might disrupt DHFR and/or TS function (Figure 2). The Maybridge Hitfinder Library™ (Maybridge, United Kingdom), containing a subset of 16,000 molecules representing the chemical diversity of the entire Maybridge database (21), was virtually screened against this pocket using Glide Standard Precision *v 3.5* (Schrödinger, New York), a third generation molecular docking program (27). Additional details have been previously reported (48).

#### **In vitro** *Enzymatic Assays of Inhibitor Activity*

The 'hits' from the Glide molecular docking studies were screened using a spectrophotometric assay for the *P. falciparum* TS-DHFR enzyme, as well as an assay using tritiated substrate and rapid chemical quench methodology for TS-DHFR activity, both performed under steady-state conditions and previously described (17). The  $IC_{50}$  was determined by plotting rate versus inhibitor concentration and determining inhibitor concentration at half maximal velocity (*v*max). Detailed methods have been previously published (17).

#### **Approximate relative free energy of binding to determine the preferred binding site**

Due to similarity of the active compounds identified by *in vitro* screening, to known activesite inhibitors, computational techniques were used to determine relative binding affinities. Based on experimental results  $(29, 30)$ , we determined that all three compounds should be in a monoprotonated ionization state, in contrast to the bisprotonated ionization state generated

by LigPrep. The correct forms of the three RJF compounds and known competitive inhibitor WR99210 were redocked in both the active site, and in the non-active site pocket of linker region. Relative free energies of binding were then calculated based on complexes from this second docking. Additional details are outlined in Supplementary Methods.

#### **Cell Culture Assays of Inhibitor Activity**

The RJF compounds were tested in erythrocytic stages of both *P. falciparum* parasite with WT and N51I/C59R/S108N/I164L quadruple mutant of DHFR. Detailed methods were as previously described  $(49, 50)$ .

#### **Co-crystallization Studies and Data Analysis**

The RJF compounds were co-crystallized in the absence of the H<sub>2</sub>-folate, the natural substrate of DHFR. RJF 01302 was co-crystallized with the WT *P. falciparum* TS-DHFR enzyme, and RJF 00670 was co-crystallized with the quadruple mutant. We also attempted to co-crystallize the RJF compounds in the presence of cycloguanil, an active-site inhibitor of DHFR. Blocking the active site of DHFR was attempted to see if the RJF compound would bind at an alternative binding site such as the non-active site pocket in the linker region. Otherwise, methods for cocrystallization of compounds with *P. falciparum* TS-DHFR, x-ray diffraction data collection, and analysis to determine the actual binding site of the compound were as previously published (51). Atomic coordinates have been deposited in the Protein Data Bank.

# **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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## **The following abbreviations were used**

TS-DHFR, thymidylate synthase-dihydrofolate reductase (this is a functional designation as dihydrofolate is produced at TS and utilized at DHFR; this enzyme is also commonly referred to as DHFR-TS in the literature because the DHFR domain is N-terminal to TS); dUMP, deoxyuridine monophosphate;  $CH_2H_4$ -folate, methylene tetrahydrofolate;  $H_2$ -folate, dihydrofolate; H4-folate, tetrahydrofolate; NADPH, nicotinamide adenine dinucleotide phosphate; HPLC, high-performance liquid chromatography; WT, wildtype.

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#### **Figure 1.**

Figure 1a Structure of WR99210 compared to those of clinically used antifolates, pyrimethamine and cycloguanil.

Figure 1b WR99210 (WR, cyan) binds successfully to the active site of the clinically important, drug-resistant, N51I/C59R/S108N/I164L "quadruple" mutant of *P. falciparum* DHFR. Unlike Pyrimethamine (Pyr, purple), WR99210 avoids steric hindrance with Asn108, which clashes with the *p*-chlorophenyl ring of pyrimethamine, the DHFR inhibitor in Fansidar™. NADPH,

an essential cofactor in the conversion of  $H_2$ -folate to  $H_4$ -folate by DHFR, is shown bound to the DHFR active site as well.



#### **Figure 2.**

Glide parameters were optimized to maximize surface binding flexibility in the non-active site pocket, as well as binding to both TS (red/pink) and DHFR (blue) domains. Here, RJF 01302 and RJC 00925 are shown binding to different regions of the non-active-site pocket.



# **Figure 3.**

MM/GBSA calculations of free energy of binding predict that RJF compounds bind to the active site of *P. falciparum* DHFR (upper panel), as confirmed by co-crystallization studies (lower panel).





#### **Figure 4.**

Figure 4a Co-crystallization studies show RJF 00670 to be bound at the DHFR active site of the quadruple mutant of *P. falciparum* TS-DHFR enzyme. The DHFR active site of this cocrystal was in its fully liganded conformation as NADPH was also bound. Hydrogen bonds between the inhibitor and the enzyme active site are shown with green dashed lines. Figure 4b Co-crystallization studies show RJF 01302 to be bound at the DHFR active site of

the WT *P. falciparum* TS-DHFR enzyme. The DHFR active site of this co-crystal was in its fully liganded conformation as NADPH was also bound. Hydrogen bonds between the inhibitor and the enzyme active site are shown with green dashed lines.

Figure 4c Superimposition of the X-ray crystal structures of RJF 00670 (shown in purple) and of RJF 01302 (shown in green) bound to the DHFR active site of *P. falciparum* TS-DHFR.



# **Figure 5.**

Overlays of the active sites of *P. falciparum* DHFR demonstrating that RJF compounds overcome drug resistance by avoiding steric clash with Asn 108. RJF 01302 (green, bottom panel), RJF 00670 (purple, top panel), pyrimethamine (navy blue) and WR99210 (cyan) are shown bound to the DHFR active site. The structures overlaid are from pdb codes 1J3K (quadruple mutant with WR99210), 1J3J (double mutant with pyrimethamine) and the co-crystal structures described in this paper.

#### **Table 1**

IC50 of RJF compounds in *in-vitro* enzyme and cell culture assays of WT and quadruple mutant *P. falciparum* TS-DHFR



#### **Table 2**

Data Collection and Refinement Statistics for Co-crystal Structures of RJF 00670 bound to the quadruple mutant *P. falciparum* TS-DHFR, and RJF 01302 bound to the WT *P. falciparum* TS-DHFR. Numbers in parentheses are for the highest resolution bin. Asterisk indicates number of residues in favored, allowed and disallowed regions by Ramachandran plot.

