

## Computational Studies on 6-Pyruvoyl Tetrahydropterin Synthase (6-PTPS) of *Plasmodium falciparum*

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**ABSTRACT:** 6-Pyruvoyl tetrahydropterin synthase (6-PTPS) is a lyase involved in the synthesis of tetrahydrobiopterin. In *Plasmodium* species where dihydroneopterin aldolase (DHNA) is absent, it acts in the folate biosynthetic pathway necessary for the growth and survival of the parasite. The 6-pyruvoyl tetrahydropterin synthase of *Plasmodium falciparum* (*Pf*PTPS) has been identified as a potential antimalarial drug target. This study identified potential inhibitors of *Pf*PTPS using molecular docking techniques. Molecular docking and virtual screening of 62 compounds including the control to the deposited Protein Data Bank (PDB) structure was carried out using AutoDock Vina in PyRx. Five of the compounds, *N*,*N*-dimethyl-*N*-[4-oxo-6-(2,2,5-trimethyl-1,3-dioxolan-4-yl)-3H-pteridin-2-yl]methanimidamide (140296439), 2-amino-6-[(1R)-3-cyclohexyl-1-hydroxypropyl]-3H-pteridin-4-one (140296495), 2-(2,3-dihydroxypropyl)-8,9-dihydro-6H-pyrimido[2,1-b]pteridine-7,11-dione (144380406), 2-(dimethylamino)-6-[(2,2-dimethyl-1,3-dioxolan-4-yl)-hydroxymethyl]-3H-pteridin-4-one (135573878), and [1-acetyloxy-1-(2-methyl-4-oxo-3H-pteridin-6-yl)propan-2-yl] acetate (136075207), showed better binding affinity than the control ligand, biopterin (135449517), and were selected and screened. Three conformers of 140296439 with the binding energy of -7.2, -7.1, and -7.0kcal/mol along with 140296495 were better than the control at -5.7kcal/mol. In silico absorption, distribution, metabolism, excretion, and toxicity (ADMET) studies predicted good pharmaco-kinetic properties of all the compounds while reporting a high risk of irritant toxicity in 140296439 and 144380406. The study highlights the five compounds, 140296439, 140296495, 144380406, 135573878 and 136075207, as potential inhibitors of PfPTPS and possible compounds for antimalarial drug development.

**KEYWORDS:** Molecular docking, drug targets, antimalarial drugs, potential inhibitors, *Plasmodium falciparum* 6-pyruvoyl tetrahydropterin synthase

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#### Introduction

Malaria is a life-threatening disease with a significant impact on the human genome as evidenced by the positive selection of protective genetic traits such as sickle cell trait and beta-thalassaemia.<sup>1,2</sup> The disease recorded an alarming number of 241 million cases leading to 627 000 deaths in 2021.3 Drugs that have been used against this disease over the years include aryl amino alcohol compounds, antifolates, artemisinin and its derivatives, and artemisinin combination therapies.<sup>4,5</sup> Antifolates are a group of drugs that inhibit the action of folic acid and have been found to be effective against many pathogens and tumor cells.<sup>6,7</sup> The pathway where this drug acts is the folate biosynthesis pathway is an important pathway essential for the survival of the parasites but absent in humans. Antifolates that were once effective against malaria have now lost efficacy due to point mutations developed by the parasite in the genes coding for the target enzymes, dihydrofolate reductase (DHFR) and dihydropteroate synthase (DHPS).8-10 Its peculiarity of only occurring in the parasite and not in humans makes it an important pathway to be targeted, thereby necessitating the need to identify and develop new strategies for treatment and alternative targets in the metabolic pathway that is crucial to overcoming drug resistance and the global burden of malaria. 11-13 New targets of the folate biosynthetic pathway have been identified, one of which is dihydroneopterin aldolase (DHNA) which is responsible for the formation of HMDMP (6-Hydroxymethyldihydropterin). This enzyme is, however, absent in the malaria parasite, and the formation of HMDMP is catalyzed by PTPS III known as Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase (PfPTPS).14 Conventional PTPS (PTPS-I) is essential for the biosynthesis of tetrahydrobiopterin (BH4), a crucial cofactor for several enzymes that play important roles such as aromatic amino acid hydroxylases, glycerol ether monooxygenases, and nitric oxide synthases.<sup>15</sup> The catalytic process of converting dihydroneopterin triphosphate (H2NTP) into HMDMP, which

constitutes the second enzymatic stage in the biosynthesis of folic acid from guanosine triphosphate (GTP), is facilitated by the enzyme 6-pyruvoyl tetrahydropterin synthase. 14,15,17 Therefore, PTPS represents a potential target for antimalarial drugs, and inhibiting its activity in the parasite could impede the synthesis of folic acid resulting in reduced folate and DNA synthesis leading to the death of the parasite. 18

Research has revealed the crystal structure of PfPTPS, which consists of a homo hexameric enzyme composed of a dimer of trimers.<sup>19</sup> Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase has been found to be critical for the survival of the P falciparum parasite, as it plays a key role in providing the missing link in folate biosynthesis.<sup>17</sup> In silico techniques, such as virtual screening, can identify potential drug candidates targeting PfPTPS.20 Such compounds would be a valuable contribution to current efforts in malaria control, which remains a significant global health burden. Various in silico techniques, including molecular dynamics simulations and virtual screening, have been proposed as effective means to identify and select relevant therapeutic targets, design compound libraries, and optimize high-affinity ligands.<sup>21</sup> The successful identification of compounds that target PfPTPS would represent a significant advancement in malaria control.

#### Methodology

Retrieval of sequence and structure

The amino acid sequence of *Pf*PTPS was retrieved with the ID: C6KTB6 from Uniprot.<sup>22</sup> The sequence was saved to be used for further studies. The three-dimensional (3D) structure of *Pf*PTPS was retrieved with the ID: 1Y13 the Protein Data Bank (PDB).

Determination of the physicochemical properties of Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase

These properties were calculated with the Expasy ProtParam<sup>23</sup> (https://web.expasy.org/protparam/) prediction server. The properties calculated include the estimated half-life, aliphatic index, isoelectric point (pI), number of positive and negative residues, molecular weight, extinction coefficient, instability index (II), and grand average of hydropathicity (GRAVY).

Prediction of the secondary structure of Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase

The SOPMA web tool<sup>24</sup> was used to predict the secondary structure secondary of Pf PTPS.

Determination of Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase active site

The CASTp server<sup>25</sup> was used to determine the active site of the enzyme.

Ligand preparation for structure-based virtual screening

Ligands were selected from PubChem,<sup>26</sup> a database of chemical molecules. Chemical structures similar to biopterin, the cocrystalized ligand for *Pf*PTPS were gotten from PubChem using the Tanimoto threshold of 85%. The Lipinski rule of 5 and the Veber rule were used to filter the results which yielded 106 conformers. To remove duplicated compounds, the Galaxy Europe platform's Remove Duplicated Molecules program<sup>27</sup> was used reducing our results to 61 compounds. In addition to biopterin, the compounds totaled 62. Energy minimization was carried out using Open Babel in PyRx.<sup>27,28</sup>

Preparation of the 3D structure of PfPTPS and virtual screening

The structure cleaning and minimization were carried out using Chimera 1.16.<sup>29</sup> The screening was carried out using AutoDock Vina Wizard in PyRx.<sup>28</sup>

Post-docking analysis

The Discovery Studio Visualizer 2021 was used to analyze the results from the docking process.

Absorption, distribution, metabolism, excretion, and toxicity properties of results

Absorption, distribution, metabolism, excretion, and toxicity (ADMET) studies estimate the pharmacokinetic properties, the toxicity risk, and the determination of a compound's chance of becoming a drug. These properties were evaluated using the OSIRIS Property Explorer too. The properties evaluated include the logarithm of solubility (Log S), the octanol-water partition coefficient (cLogP), the topological polar surface area (TPSA), the drug-likeness, and the drug score. The mutagenicity, tumorigenicity, irritant risk, and reproductive toxicity were evaluated.

#### Results and Discussion

Physicochemical properties of Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase

Table 1 shows the computed physicochemical properties of *PfPTPS*. The physicochemical parameters of a protein are determined by its composition. The enzyme, *PfPTPS* is made up of

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Table 1. Computed physicochemical properties of PfPTPS.

NUMBER OF AMINO ACIDS	MOLECULAR WEIGHT	PI	INSTABILITY INDEX	ALIPHATIC INDEX	GRAVY	EXTINCTION COEFFICIENT	HYDROPHILIC RESIDUES	HYDROPHOBIC RESIDUES
173	20060.82	5.98	46.44	91.73	-0.364	13660	59.1%	30.4%

Abbreviations: GRAVY, grand average of hydropathicity; PfPTPS, Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase.

#### Percentage of Amino Acids

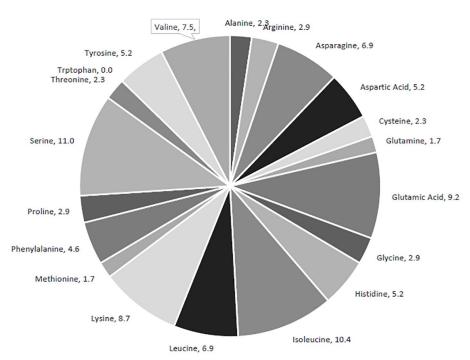


Figure 1. The percentage of amino acids present in PfPTPS. PfPTPS indicates Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase.

173 amino acids (aa) and 2810 atoms. The most abundant amino acid residue is serine (11%), closely followed by isoleucine (10.4%) and then by glutamate (8.7%). The amino acid, tryptophan was absent in the enzyme. The amino acid composition is shown in Figure 1. The hydrophilic nature is influenced by the high number of hydrophilic residues (59.1%) compared with the hydrophobic residues (30.4%), and this prediction is supported by the negative GRAVY value of -0.364.30 The number of negatively charged residues is 25 whereas positively charged residues numbered 20. The pI is 5.98, and the molecular weight of the protein is 20060.82 Da (20.06 kDa). These properties are necessary for determining the area of gel where this enzyme can be identified.<sup>31</sup> The protein's acidic nature is further shown by the pI at 5.98. The II is computed to be 46.44 classifying the protein as unstable. The aliphatic index of the enzyme is 91.73. A high aliphatic index indicates the thermostability of the enzyme over a wide temperature range.<sup>32</sup> This protein does not contain any Trp residues which indicates that it might result in a 10% error in the extinction coefficient. The extinction coefficient is 13660 M<sup>-1</sup> cm<sup>-1</sup> at 280 nm in water with an absorbance of 0.681 assuming all pairs of cysteine residues form cystines.

### Determination of the active site of Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase

The amino acid residues that were found in the active site are shown in Table 2. The active sites of 1Y13 consist of 23 amino acids. There were no cysteine residues found in the active site which is consistent with findings reported by a previous study.<sup>14</sup>

### Prediction of *Plasmodium falciparum* 6-pyruvoyl tetrahydropterin synthase secondary structure

The type of motifs of secondary structures predicted for *Pf*PTPS includes the alpha helix, the extended strand, the random coil, and the beta-turn. The highest percentage was recorded for the alpha helix (34.04%), closely followed by the extended strand (30.64%), random coil (29.48%), and beta-turn (5.78%). High percentages of alpha helix and extended strands are reported to play important roles in the compactness, folding, and stability of a protein (Figure 2).<sup>33</sup>

#### Virtual screening analysis

The lower the negative value, the higher the ligand's affinity for the protein. A total of 62 compounds, including biopterin, were

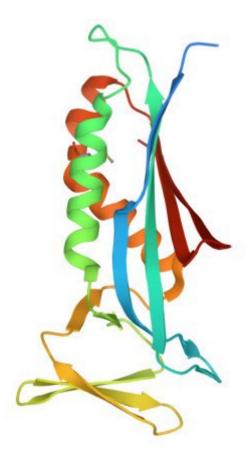
Table 2. The amino acid residues present in the active site of PfPTPS.

#### **AMINO ACID RESIDUES**

1Y13

SER13, ALA14, GLU15, SER17, VAL18, GLU19, SER48, LEU49, LYS50, ARG52, TYR154, GLU156, ILE157, SER158, SER160, SER162, PRO163, THR164, GLN165, LYS166, ILE168, HIS170, TYR172

Abbreviation: PfPTPS,  $Plasmodium\ falciparum\ 6$ -pyruvoyl tetrahydropterin synthase.



**Figure 2.** The 3D structure of *Plasmodium falciparum* 6-pyruvoyltetrahydropterin synthase (PDB:1Y13\_Chain A). PDB indicates Protein Data Bank.

blindly docked into *Pf*PTPS, and 7 best hits were obtained and are shown in Table 3. The binding affinities of the top 7 hits were between -7.2 and -6.7 kcal/mol which was lower and therefore better than that of the co-crystallized ligand biopterin, with a binding affinity of -5.7 kcal/mol. Compound 140296439 had the lowest binding affinity of -7.2 kcal/mol signifying its potential to inhibit *Pf*PTPS, thereby limiting the synthesis of folate and the activity of the parasite.

#### Post-screening analysis

The interactions of the ligands in the active site of *Pf*PTPS were analyzed with Discovery Studio 2021 client. The interactions shown from the post-screening analyses include hydrogen bonds, electrostatic interactions, and hydrophobic bonds (Table 4). The binding affinity is the strength of and is

influenced by these interactions.<sup>34</sup> Compound 140296439 in its different poses made up 3 of the 7 best hits, taking up positions 1 to 3. These different poses shown in Figure 3 contributed to the different types of interactions as well as residues to which it was bonded. This compound possesses 6 hydrogen bond acceptor (HBA) and 1 hydrogen bond donor (HBD). This compound and its interactions in the 3 poses are shown in Figures 4 and 5A. However, the high-binding energies suggest the strong affinity of this compound to the enzyme. This compound should be further studied for its affinity and possible inhibitory actions on PfPTPS. The first pose (Figure 3A) with a docking score of -7.2 kcal/mol forms 3 hydrogen bonds with SER160, ASN46 and GLU19, 2 electrostatic bonds with LYS166 and GLU19, and a hydrophobic bond with LYS166. The second pose of compound 140296439 (Figure 3B) with a binding energy of -7.1 kcal/mol formed 2 hydrogen bonds with SER24 and ASN44 and a hydrophobic bond with PRO163. The third pose (Figure 3C) with a binding energy of -7.0 kcal/mol forms hydrogen bonds with ASN46 and GLU156, electrostatic interactions with LYS166 and GLU19, and hydrophobic interactions with LYS166. With a binding energy of -6.8 kcal/mol, 5HBA and 3HBD compound 140296495 formed 6 hydrogen bonds with the active sites of the enzyme. It formed 2 hydrogen bonds with SER88 and single bonds with ILE86, LEU91, LYS92, and PHE93, and hydrophobic interactions with PHE93 and ILE100 are shown in Figure 5B. Compound 144380406 possesses 7HBA and 3HBD and formed 2 hydrogen bonds with SER160 and LYS166 (Figure 6A). Compound 135573878 bonded to the active sites of the enzyme with a binding energy of -6.7 kcal/ mol. With 7HBA and 3HBD, it formed hydrogen bonds with ASN44, SER160, and LYS166 and hydrophobic interactions with PRO163. Compound 136075207 with 8HBA and 1HBD formed hydrogen bonds with ASN44, SER48, SER160, LYS166, SER158, and SER160. The control compound biopterin (135449517) with 6HBA and 4HBD bonded to the enzyme at a binding energy of -5.7 kcal/mol which is significantly lower than the top hits selected (Figure 7). It formed hydrogen bonds with SER24 and hydrophobic interactions with PRO163. With the exception of the control compound, 140296495 did not form any unfavorable bonds with the active site of PfPTPS (Figure 5B).

# The drug-like and absorption, distribution, metabolism, excretion, and toxicity properties of the best hits

The drug-like and ADMET properties of the hits are shown in Table 4. Compounds with lesser molecular weight are more easily distributed, therefore the standard of 500g/mol. The molecular weights of these compounds were within the range of 291.00 and 332.00g/mol which is below the set standard. The cLogP is an indicator of hydrophilicity and absorption, values greater than 5 are considered highly hydrophilic with poor absorption. The study

Table 3. The structures and binding affinities of the best hits in comparison with the co-crystallized ligand, biopterin.

S/N	COMPOUND NAME AND ID	2D STRUCTURES	BINDING AFFINITY (KCAL/MOL)
1	N,N-dimethyl-N'-[4-oxo-6-(2,2,5-trimethyl-1,3-dioxolan-4-yl)-3H-pteridin-2-yl]methanimidamide (140296439, First Pose)	Absolute  H H H H H H H H H H H H H H H H H H	<b>-7.2</b>
2	N,N-dimethyl-N'-[4-oxo-6-(2,2,5-trimethyl-1,3-dioxolan-4-yl)-3H-pteridin-2-yl]methanimidamide (140296439; Second Pose)	Absolute  H H H H H H H H H H H H H H H H H H	<b>−7.1</b>
3	N,N-dimethyl-N'-[4-oxo-6-(2,2,5-trimethyl-1,3-dioxolan-4-yl)-3H-pteridin-2-yl]methanimidamide (140296439; Third Pose)	Absolute  H H H H H H H H H H H H H H H H H H	<b>-7.0</b>
4	2-Amino-6-[(1R)-3-cyclohexyl-1-hydroxypropyl]-3H-pteridin-4-one (140296495)	Absolute  H H H H H H H H H H H H H H H H H H	-6.8
5	2-(2,3-Dihydroxypropyl)-8,9-dihydro-6H- pyrimido[2,1-b]pteridine-7,11-dione (144380406)	Absolute  H H H H H H H H H H H H H H H H H H	-6.8

Abbreviation: 2D, two-dimensional.

 $\textbf{Table 4.} \ \ \textbf{The type of interactions and the bond lengths between the ligands and the active site of \textit{Pf} PTPS.}$ 

SERIAL NUMBER	PUBCHEM CID	HYDROGEN BOND ACCEPTORS	HYDROGEN BOND DONORS	BOND LENGTHS AND INTERACTIONS
1	140296439 (First Pose)	6	1	Hydrogen bonds:  Conventional Hydrogen Bond: SER160 (2.70 Å), ASN 46 (3.02 Å)  Carbon-Hydrogen Bond: GLU 19 (3.30 Å)  Electrostatic interactions:  Pi-Cation: LYS166 (3.05 Å)  Attractive Charge: GLU 19 (4.16 Å)  Hydrophobic interactions:  Pi-Alkyl: LYS166 (5.13 Å)
2	140296439 (Second Pose)	6	1	Hydrogen bonds:  Conventional Hydrogen Bond: SER 24 (2.84 Å) Carbon-Hydrogen Bond: ASN 44 (3.66 Å) Hydrophobic interactions: Pi-Alkyl: PRO 163 (4.80 Å)

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SERIAL NUMBER	PUBCHEM CID	HYDROGEN BOND ACCEPTORS	HYDROGEN BOND DONORS	BOND LENGTHS AND INTERACTIONS
3	140296439 (Third Pose)	6	1	Hydrogen bonds:  Carbon-Hydrogen Bond: ASN 46 (3.58 Å), GLU 156 (3.64 Å)  Electrostatic interactions:  Pi-Anion/Pi-Cation/Attractive Charge: LYS 166 (2.56 Å, 3.20 Å), GLU 19 (4.09 Å, 3.48 Å)  Hydrophobic interactions:  Pi-Alkyl: LYS 166 (5.27 Å)
4	140296495	5	3	Hydrogen bonds:  Conventional Hydrogen Bond: ILE 86 (2.89 Å), SER 88 (2.82 Å, 2.52 Å), LEU91 (2.83 Å), PHE93 (2.04 Å), LYS92 (3.17 Å)  Hydrophobic interactions:  Alkyl/Pi-Alkyl: ILE 100 (4.89 Å), PHE93 (5.25 Å)  Pi-Pi T-Shaped: PHE93 (5.32 Å, 5.41 Å)
5	144380406	7	3	Hydrogen bonds:  Conventional Hydrogen Bond: SER160 (2.09 Å), LYS166 (2.27 Å)
6	135573878	7	2	Hydrogen bonds:  Conventional Hydrogen Bond: ASN44 (2.92Å), SER160 (3.01Å), LYS166 (2.28Å)  Hydrophobic interactions:  Pi-Alkyl: PRO163 (4.99Å, 4.60Å)
7	136075207	8	1	Hydrogen bonds:  Conventional Hydrogen Bond: ASN44 (2.60 Å), SER160 (2.63 Å), SER48 (2.68 Å), LYS166 (2.33 Å)  Carbon-Hydrogen Bond: SER158 (3.40 Å), SER160 (3.54 Å)  Hydrophobic interactions:  Pi-Alkyl: PRO163 (3.79 Å, 4.09 Å)  Amide-Pi Stacked: SER162 (4.27 Å, 4.33 Å)
8	135449517 (biopterin)	6	4	Hydrogen bonds:  Conventional Hydrogen Bond: SER24 (2.24 Å) Hydrophobic interactions:  Pi-Alkyl: PRO163 (4.69 Å, 5.12 Å)

Abbreviation: PfPTPS, Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase.

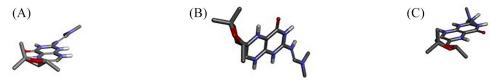


Figure 3. The different poses of compound 140296439; (A)Pose 1, (B)Pose 2, (C) Pose 3.

predicted for all compounds cLogP values less than 5. The TPSA is an indicator of oral bioavailability and according to the Veber rule must not be greater than 140; all hits adhered to this rule and had TPSA less than 140. The log S value is the logarithm of the molar solubility of a compound in water, measured in mol/dm³ and must be within the ranges of –4 to 6, of which all hits adhered. The drug-likeness of a compound indicates the presence of common drug fragments in the compound. Only compounds 135573878 and 140296495 had negative drug-likeness values of –5.19 and –2.88, respectively. The drug score parameter combines

all other predictions into a grand total, a number indicating the drug potential of a compound. A high drug score value, a better chance of a compound's potential of becoming a drug. The highest drug score value of 0.77 was recorded for compound 136075207. The resulting toxicity properties are color-coded. Properties coded in green implied safety, orange implied mild toxicity, and red implied the chances of unwanted consequences. No compounds showed risk of mutagenicity, tumorigenicity, or reproductive toxicity. Compounds 140296439 and 144380406 were predicted to have high irritant risk.

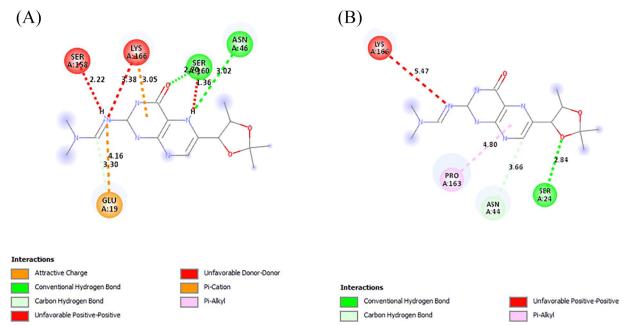
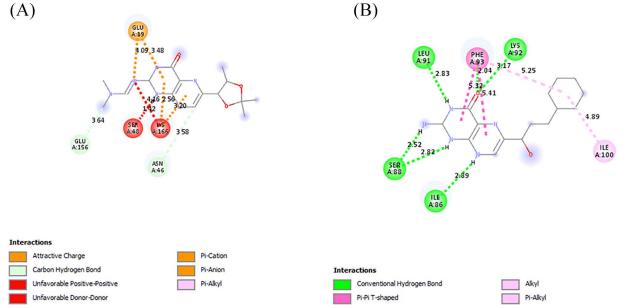


Figure 4. The interactions of the first (A) and second (B) pose of compound 140296439 with the active site of PfPTPS. PfPTPS indicates Plasmodium falciparum 6-pyruvoyl tetrahydropterin synthase.



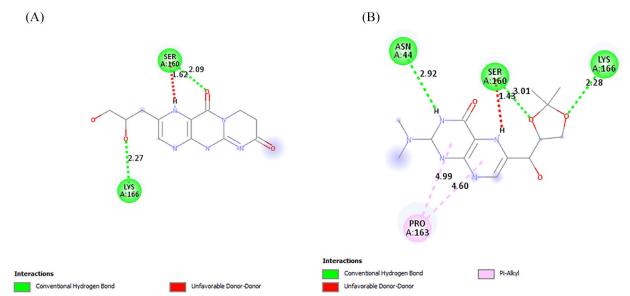
**Figure 5.** The intermolecular interactions between the active site of *Pf*PTPS and the third pose of compound 140296439 (A) and compound 140296495 (B). *Pf*PTPS indicates *Plasmodium falciparum* 6-pyruvoyl tetrahydropterin synthase.

#### **Discussion**

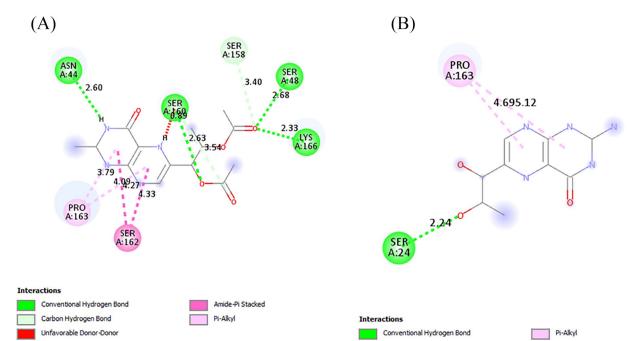
The best hits' binding affinities were lower than the biopterin indicating a high-affinity binding. The type of interactions and their bond lengths between the different compounds and the protein was identified via the post-screening analysis. Compound 140296439 with the lowest binding energy of -7.2 kcal/mol engaged with the protein's active site by forming 2 conventional hydrogen bonds (SER 160, ASN 46) and 1 carbon-hydrogen bond (GLU 19). This compound in its other poses also made up the next 2 best ligand efficiency with

docking scores other 2 poses had low-binding energies of -7.1 and -7 kcal/mol. The binding energies of the compounds are in the order: 140296439 > 140296439 > 140296439 > 140296439 > 14029649 5 > 144380406 > 135573878 > 136075207 (Table 4). With the exception of 140296495, all the compounds formed interactions with the amino acid residues in the active site as predicted by CASTp (Tables 2 and 5). The ADMET and toxicity study conducted revealed that despite all the compounds possessing good pharmacokinetic properties, some of them still possessed high irritant toxicity risk (Table 4). The drug scores

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**Figure 6.** The intermolecular interactions between the active site of *Pf*PTPS and compound 144380406 (A) and compound 135573878 (B). *Pf*PTPS indicates *Plasmodium falciparum* 6-pyruvoyl tetrahydropterin synthase.



**Figure 7.** The intermolecular interactions between the active site of *Pf*PTPS and compound 136075207 (A) and the control compound biopterin, 135449517 (B). *Pf*PTPS indicates *Plasmodium falciparum* 6-pyruvoyl tetrahydropterin synthase.

are in the order: 136075207 > 140296439 > 140296495 = 1443 80406 = 135573878. The toxicity risk can, however, be removed by hit-to-lead optimization, this is because toxicity is caused by the presence of a high-risk fragment/pharmacophore in the compound.<sup>35</sup> This study is, however, limited by the fact that little is known about the *Pf*PTPS enzyme and that known inhibitors have not yet been identified for this enzyme, especially in *Plasmodium* parasites.

#### **Conclusions**

The folate biosynthetic pathway is an essential drug target due to its absence in the human host and should not be ignored in the fight against malaria. It still presents opportunities to identify new targets and design inhibitors and drugs against these targets. In this study, following ligand library preparation and processing, we employed the molecular docking process to identify hit compounds with lower binding energies than the

PHARMACOKINETIC PROPERTIES COMPOUND MW **TOXICITY RISK** DRUG REPRODUCTIVE **SOLUBILITY CLOGP TPSA** DRUG **MUTAGENICITY TUMORIGENICITY** IRRITANT LIKENESS SCORE **RISK** TOXICITY 140296439 332.00 -2.14 -0.32101.3 1.98 0.51 Pass Pass Pass -3.10 -2.88 Pass 140296495 303.00 0.54 113.4 0.47 Pass Pass Pass Pass Pass 144380406 291.00 -1.10-1.64128 0.58 0.47 Pass 135573878 321.00 -1.12 -1.28 109.1 -5.19 0.47 Pass Pass Pass Pass 136075207 320.00 -0.66119.8 0.77 Pass Pass Pass Pass -1.660.68 135449517 237.00 -1.11 -2.28 133.7 0.99 Pass Pass Pass

**Table 5.** The toxicity risks and ADMET properties of the hits.

Abbreviations: ADMET, absorption, distribution, metabolism, excretion, and toxicity; cLogP, octanol-water partition coefficient; TPSA, topological polar surface area.

ligand, biopterin. We recommend that stability studies and confirmatory in vitro and in vivo studies be undertaken, as well as employing hit-to-lead (H2L) optimization necessary to remove the observed toxicity.

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#### **Author Contributions**

SNC, MBO and EA: Conceptualization; MBO and EO: Paper writing; MBO, EO and RA: Data collection and analysis; SNC and EA: Critical revision and supervision.

#### **Research Ethics and Patient Consent**

Not applicable.

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