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Original article

Screening potential inhibitor from actinomycetes for Dihydrofolate reductase of *Staphylococcus aureus* – In vitro and in silico studies

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ABSTRACT

Cellulitis is a skin disease which is caused by the pathogen *Staphylococcus aureus*. The protein Dihydrofolate reductase is an important drug based target for Trimethoprim. Dihydrofolate reductase is reversibly inhibited by the drug trimethoprim. One of the major enzymes responsible for converting dihydrofolic acid into tetrahydrofolic acid. The screening of microbial natural products, Soil isolation is a rich source of actinomycetes. The actinomycetes sp. KK21-2 strain isolated from the soil, the aqueous extract of the isolates yielded 33 active metabolites from the LC-MS analysis. Based on the ADMETox analysis, 8 compounds were excluded and finally 25 compounds were selected for the docking analysis. Protein structure of *S. aureus* retrieved from PDB, drug and compounds were obtained from the PubChem Database. Molecular docking (XP) and Induced Fit Docking (IFD) were completed utilizing the Glide Module of Schrodinger. Molecular dynamics simulation employing the Schrodinger Desmond module was used to examine the stability of the docked complex. From the results of docking analysis and MD Simulation result 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl) phenylhydantoin have suggest this compound have multi- targeting potency against the cellulitis skin disease from the pathogen *Staphylococcus aureus*, in future need to be verified through *in vitro* and *in vivo* analysis.

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1. Introduction

Actinomycetes are the most important microorganism in nature that primarily survives in the soil (Pandey et al., 2011) which produced a variety of essential bioactive compounds of high value. Frequent screening of actinomycetes for new bioactive compounds resulted with around two thirds of natural antibiotics, many of which are medicinally important (Okami and Hotta, 1988). Actino-

mycetes are filamentous, sporulating gram-positive bacteria rich in G + C content which accounts for 55–75 percent of DNA. Cellulitis, a bacterial skin infection, affects more than 14 million people annually in the United States (Raff and Kroshinsky, 2016). The disease cellulitis is caused mainly by methicillin-sensitive *Staphylococcus aureus* and *Streptococcus pyogenes* (Cranendonk et al., 2017).

The current antibiotic used against cellulitis disease is Cephalosporins, aminoglycosides, penicillin, trimethoprim, cephalexin, clindamycin (Patil et al., 2018). and the adverse effect were observed while using these drugs are Eosinophilia, Thrombocytopenia Hypersensitivity reaction, clostridioides and Leukopenia (Norrby, 2012). To overcome this issue we need to develop a new drug to reduce the side effects. At earlier phases of the drug development process, *in silico* approaches have the ability to anticipate negative side effects for example drug-target interactions (Hodos et al., 2016).

In drug designing, computational approach aids in identifying a ligand that can effectively bind to the target protein molecule and also to predict the properties of the docked complex (Kaapro and

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Ojanen, 2002). In recent years, molecular docking has been widely used in academic and professional contexts as a speedy and inexpensive method. The main purpose of ligand protein docking is to investigate the superior ligand binding modes with the target protein. Molecules orientation and conformation within a macromolecular target's binding site are examined using a technique called molecular docking. Possible postures are generated by search algorithms and ranked by scoring functions. The two primary processes of molecular docking computations are posing and scoring, which provide a prioritized list of potential complexes between target and ligands (Torres et al., 2019) The two primary causes of drug failure are safety and lack of effectiveness. ADMET stands for Absorption, Distribution, Metabolism, Excretion and Toxicity. In addition to having sufficient activity against the therapeutic target, a high-quality drug candidate should display the proper ADMET properties at a therapeutic dose. (Guan et al., 2019). This study focused on antibacterial activity by inhibiting the growth of *S.aureus*, identifying the compounds present in the actinomycetes extract with significant activity through LC-MS analysis and identifying the novel lead compound.

2. Material and methods

2.1. Sample collection

Fifty soil samples were collected from foot hills of Siruvani (Latitude is 10.9378° N and Longitude is 76.6870° E.), Velliangiri (Latitude is 10.9833° N and Longitude is 76.6927° E.) and surrounding areas of foot hills in Coimbatore district. The samples were collected in small clean, sterile poly vinyl pack bags properly labeled with place and date of collection, immediately transferred to the laboratory and stored in the refrigerator for further analysis.

2.2. Isolation of pure actinomycetes

Actinomycetes were isolated using the standard microbiological method. One gm of dried soil sample was suspended in 100 ml of sterile water and serial dilution from 10^{-2} to 10^{-7} were prepared. Maximum 10^{-4} , 10^{-5} and 10^{-6} dilution are maximum number of actinomycetes colonies were produced. The Starch casein nutrient agar (SCNA) medium composition are soluble starch- 10 g, casein- 0.3 g, KNO_3 - 2 g, NaCl - 2 g, K_2HPO_4 - 2 g, $\text{MgSO}_4 \cdot 7\text{H}_2\text{O}$ - 0.05 g, CaCO_3 - 0.02 g, $\text{FeSO}_4 \cdot 7\text{H}_2\text{O}$ - 0.01 g, Agar- 20 g and distilled water- 1000 ml, pH 7.0 \pm 0.2 was used for isolation of actinomycetes. The plates were incubated at room temperature (28 °C) after inoculation for 7–14 days. After the 7 to 9 days of incubation period small colonies, white pin point, powdery colonies were observed from which pure cultures were separated and maintained in both plates and slants for further analysis. For longer period storage glycerol stock was prepared and maintained in refrigerator at 4 °C.

2.3. Protein data Bank (PDB)

A 3D structural database for large biological entities like proteins and nucleic acids is known as Protein Data Bank (PDB) (Mir et al., 2017). The data, normally collected by X-ray crystallography, NMR spectroscopy and cryo-electron microscopy and provided by biologists and biochemists from throughout the world. The target protein structures of *S. aureus* retrieved from PDB for this study were Dihydrofolate reductase (PDB ID: 6E4E).

2.4. Pubchem database

Pubchem is a database which provides the compounds chemical molecules and the activity observed in the biological assays. The National Centre for Biotechnology Information (NCBI) is responsible for maintaining the database. Pubchem database had a wide range of characteristics for the molecules including chemical structure fragments of name molecular weight chemical formulation donor and acceptor bond count XLogP (Kim et al., 2019). The selected 33 LC-MS compounds structures were retrieve using Pubchem Database.

2.5. Drug Bank database

The DrugBank database is an extensive, openly available online resource that was built and is continuously updated with data on medications and therapeutic targets. It includes proprietary describing clinical data on drugs like side effects and drug interactions of the drugs (Wishart et al., 2008). The Trimethoprim structure is retrieved from Drug Bank Database.

2.6. LC-MS analysis

LC-MS methods are separates chemicals in a sample by liquid chromatography and further examines and identifies them by a mass spectrometer. Polar solvents were used like methanol and water (Pitt, 2009). Liquid chromatography-mass spectrometry (LC-MS) was used to further analyze the crude water extract of isolated soil actinomycetes KK21-2 and determine the secondary metabolites. The LC-MS was performed by SAIF IIT Bombay. The Acquisition method used is 30mins_+ ESI_10032014_MSMS and the Ion source is Dual AJS ESI. Using European Mass Bank, the detected compounds were compared.

2.7. ADME properties

ADME stands for “absorption, distribution, metabolism, and excretion” in pharmacokinetics and pharmacology. The four factors together affect the drug levels and kinetics of tissue exposure, which in turn affects the effectiveness and pharmacological activity of the chemical as a medicine (Tibbitts et al., 2016). ADME properties was evaluated for LC-MS derived compounds using the Qikprop 3.5 of Schrodinger module (Ganjuly and Debneeth, 2014).

2.8. Protein preparation

The protein molecule was preprocessed, missing hydrogen atoms were added, bond orders were given, disulfide connections were created, and the orientation of the amino acid's hydroxyl groups, amide groups of Asn, and Gln, was optimised in the protein production wizard. The grid was created to encompass the active site residues identified by the multiple sequence alignment. The force field OPLS3e was fixed by constructing potential ionised and tautomerized structures using the Ligprep tool within a predetermined pH range. Through XP, ligand docking was carried out utilising chosen ligands and chosen pathogen targets (Syed Abuthahir et al., 2019).

2.9. Active site prediction

Protein functions depends on active sites. This either inhibits or stimulates protein functions. The main database for information on proteins is Uniprot, particularly information on the active site's various sorts of binding capacities with substances including tiny molecules, metals, DNA, and smaller proteins, among other things (Bairoch et al., 2005). Sitemap is a tool developed by Schrodinger to

predict with a high degree of accuracy the binding site of protein molecules and the druggability of the sites. (Schmidtke and Barril, 2010). protein crystal structures that have been solved and multiple sequence alignment utilising the Clustal Omega server, and Schrodinger site map software were used to identify the active site of the chosen targets of *S. aureus*. (Zhang et al., 2008).

2.10. Ligand preparation

The LC-MS ligands employed in this investigation were those from Actinomycetes aqueous extract that showed action against bacterial infections. According to Peach et al. (2012), the QikProp module of Schrodinger was used to analyse the 3D structures for ADMETox. Features including the Rule of Five, oral absorption, QPlog Po/w, QplogS, Qpp Caco, Qplag HERG, QPP MDCK, PSA, HB Donars, and HB Acceptor.

2.11. Molecular docking – XP docking

The four important steps were followed to use the Schrodinger Glide module for protein–ligand docking. They are 1. Protein preparation, 2. Receptor Grid generation, 3. Ligand preparation and 4. Ligand docking (Ban et al., 2018).

The preprocessing of the protein molecules includes the insertion of hydrogen atoms, the distribution of bond orders, the creation of disulfide bonds, improvement of the orientation of amide and hydroxyl groups. The energy minimization force field used was OPLS3e. The grid was built to encompass the active site residues. The same force field was used to prepare the ligands, and the Ligprep tool was used to optimise the ligand molecules. Finally the ligand docking was carried out using the chosen ligands for specific pathogen targets through extra precision (XP) docking (Abuthakir et al., 2022).

2.12. Induced Fit docking

Using Schrodinger software, Induced fit docking was used, in which the binding site is adjusted in accordance with the ligand's binding manner and the receptors are flexible. For the docking and the structure refinement, used the Glide and Prime modules. Induced Fit Docking includes protein preparation, grid generation and selecting active site residues with length of <20 Å for binding. Based on the XP docking results, the top three ligand molecules were selected for the IFD docking. At the end of IFD, multiple poses were generated, the optimum pose was chosen after all poses were examined for their dock score interactions with active site residues (Clark et al., 2016).

2.13. Molecular dynamic simulation

The complexes that are docked and chosen based on the IFD analysis were conducted to test the stability of the complexes employing use of Schrodinger Biosuite for molecular dynamics simulation. The docked complex of Dihydrofolate reductase protein and 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin compound were recorded during a 50 ns time span for Molecular Dynamic Simulation. System builder was initially responsible for starting the MD simulation and further force field, solvent model and boundary conditions. The complex was centered with a 10 Å distance as boundary conditions for the MD simulation, this was performed with the help of the OPLS 2005 force field (Abuthakir et al., 2021). The steepest descent algorithm was used to reduce the energy of complicated structures which Desmond uses as an equilibration technique (Fu et al., 2018). The RMSD of

protein was produced using simulation event analysis and Understanding the stability of the ligand inside the protein's binding site through ligand bond proteins, protein–ligand interactions, and RMSF of the protein and ligand (Balakrishnan et al., 2022).

3. Results

3.1. Isolation of actinomycetes

A total of 50 soil samples were taken from foot hills of Siruvani, Velliangiri and surrounding area, 75 strains were isolated using SCNA medium from the isolate KK21-2 produce the good results with comparing with all other isolates (Figs. 1–4). So, this KK21-2 strain is further performed for the LC-MS analysis.

3.2. Protein data Bank (PDB)

The 3D structures of *Staphylococcus aureus* target protein Dihydrofolate reductase (PDB ID: 6E4E) is retrieved from Protein Data Bank (Fig. 5).

3.3. LC-MS analysis

By using LC-MS analysis, the isolated strain KK21-2 aqueous 's extract had a total of 33 compound that could be identified. (Fig. 6). The compound name, retention time, mass of the compounds, molecular weight, molecular formula are listed in Table.1.

3.4. ADME properties

The 3D structures of 33 LC-MS compounds detected by of Aqueous extract of actinomycetes were retrieved, more investigation on these compounds ADMET analysis using QikProp. It revealed that 25 compounds were within the range, hence proceed for further analysis. The remaining 8 compounds viz., His Met Lys, Arg Val Trp, Phe Phe, Gln Gln Lys they are amino acids which may be the broth component so excluded. 10-Deoxymethymycin, Dactinomycin, were excluded as they didn't obey Lipinski's rule, had three reactive groups and four violation in Rule of 5. N-acetyl aspartyl glutamic acid and Leupeptin the Human Oral Absorption < 25%. The remaining twenty five compounds were listed and further analysed in Table.2.

3.5. Active site prediction

The active site of selected target *S.aureus* is identified from the Uniprot and Schrodinger sitemap module. From the active site residues some may identified as important binding from the Uniprot. (Table 3).

3.6. Docking analysis

The selected target of Dihydrofolate reductase (6E4E) was docked with selected twenty five compounds and the specific drug by using XP docking and top 3 compounds were put thru induced fit docking (IFD).

3.6.1. *Staphylococcus aureus*: Dihydrofolate reductase

The leading three substances from XP docking with Dihydrofolate reductase were 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin with the dock score of –10.3 kcal/mol and 3H- bonds, PGF2alpha isopropyl ester with the dock score of –10.0 kcal/mol and 4H- bonds and Napthyl glucuronide with the dock score of –9.2 kcal/mol and 3H- bonds. The drug



Fig. 1. Isolates of actinomycetes from soil samples.

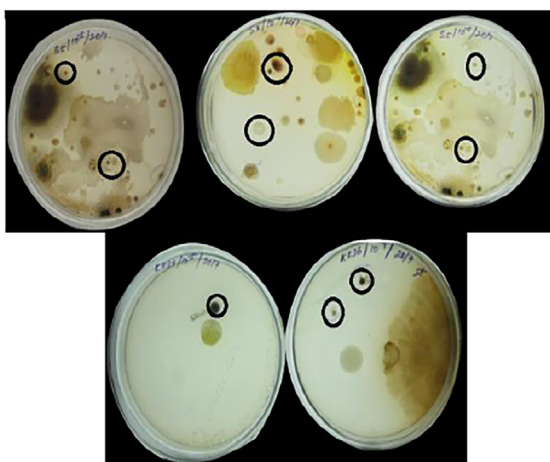


Fig. 2. Cultures from different soil samples.

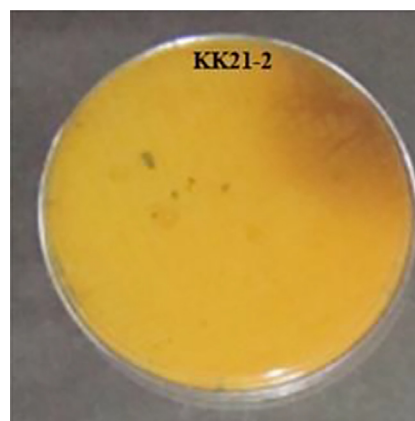


Fig. 4. Pigment produced by KK21-2 strain.

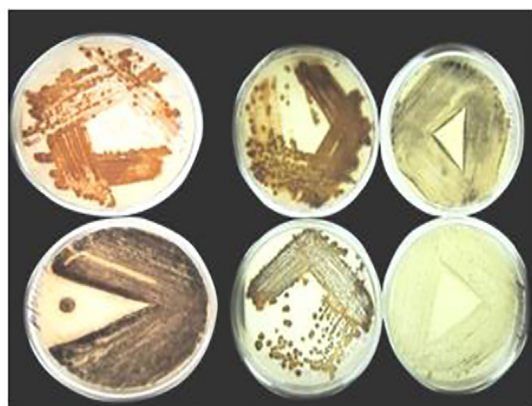


Fig. 3. Some of the pure cultures.



Fig. 5. Dihydrofolate reductase (PDB ID: 6E4E).

Trimethoprim produced the dock score as -7.4 kcal/mol with 4H-bond interactions. Of the 25 compounds, 22 had docking with Dihydrofolate reductase protein. The XP docking results of top ten compounds with Dihydrofolate reductase are presented in [Table 4](#).

3.6.2. Induced fit docking

The IFD results of Dihydrofolate reductase exhibited variation in positions of the top three compounds and the dock scores. In the top position was 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin with dock score of -12.8 kcal/mol and it had 5H-bonds with Ala 7, Ile 14, Thr 46, Phe 92, Thr 121. The second compound Naphthyl glucuronide which was in the third position in XP docking had dock score of -12.0 kcal/mol and 6H-bonds with Ala 7 (2), Ile 14, Thr 46, Phe 92 (2). The third compound in IFD was

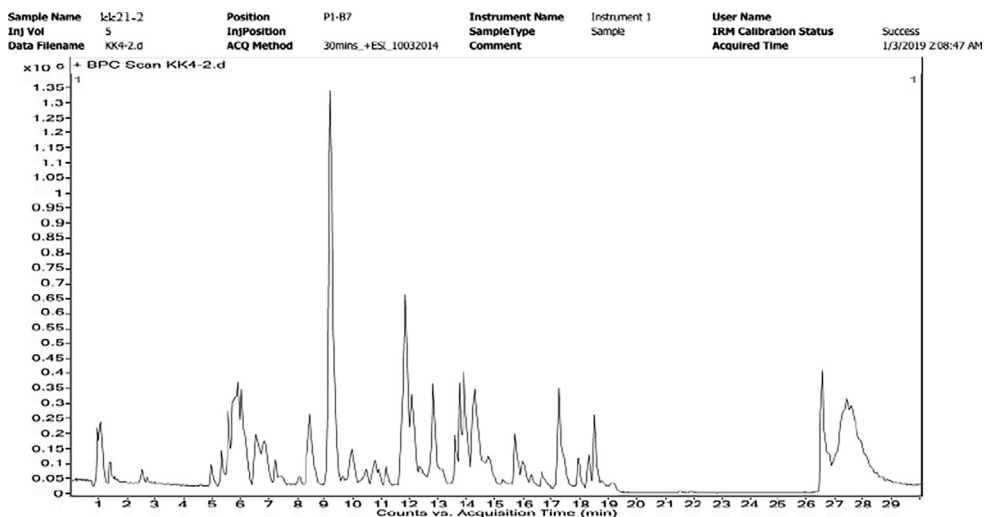


Fig. 6. LC-MS study of KK21- 2 Aqueous extract.

Table 1
Compounds identified by LC-MS analysis of the Aqueous extract KK21-2.

S.No	Compound Name	Retention time	Mass from LC-MS	Molecular weight	Molecular formula
1	N-Ethylaniline	1.007	121.0886	121.0886	C ₈ H ₁₁ N
2	3-Pyridylacetic acid	1.015	137.0468	137.0468	C ₇ H ₇ N O ₂
3	Dextroamphetamine	1.057	135.104	135.104	C ₉ H ₁₃ N
4	Paramethasone	5.034	393.1982	392.1982	C ₂₂ H ₂₉ F O ₅
5	10-Deoxymethymycin	5.667	453.3132	453.3132	C ₂₅ H ₄₃ N O ₆
6	Naphthylglucuronide	6.629	320.0911	320.0911	C ₁₆ H ₁₆ O ₇
7	3'-Hydroxytrimethoprim	6.854	276.1184	276.1184	C ₁₃ H ₁₆ N ₄ O ₃
8	Umbelliferone	7.357	162.0305	162.0305	C ₉ H ₆ O ₃
9	5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin	8.404	286.0949	286.0949	C ₁₅ H ₁₄ N ₂ O ₄
10	D-Biotin	8.442	244.0853	244.0853	C ₁₀ H ₁₆ N ₂ O ₃ S
11	Dihydrodeoxy streptomycin	9.163	567.2839	567.2839	C ₂₁ H ₄₁ N ₇ O ₁₁
12	PhePhe	9.437	312.1519	312.1519	C ₁₈ H ₂₀ N ₂ O ₃
13	IrigeninTrimethyl Ether	10.447	402.1273	402.1273	C ₂₁ H ₂₂ O ₈
14	Haematoxylone	11.144	372.1179	372.1179	C ₂₀ H ₂₀ O ₇
15	His Met Lys	11.768	414.2012	414.2012	C ₁₇ H ₃₀ N ₆ O ₄ S
16	Arg Val Trp	11.77	459.2581	459.2581	C ₂₂ H ₃₃ N ₇ O ₄
17	TrpGlu Pro	11.87	392.2191	430.1743	C ₂₁ H ₂₆ N ₄ O ₆
18	Hydroxycortisol	11.872	378.5000	378.5000	C ₂₁ H ₃₀ O ₆
19	4-Biphenylamine	12.324	169.0885	169.0885	C ₁₂ H ₁₁ N
20	Fluorenylacetamide	12.407	223.0983	223.0983	C ₁₅ H ₁₃ N O
21	Dactinomycin	13.157	254.6195	1254.6195	C ₆₂ H ₈₆ N ₁₂ O ₁₆
22	N-acetyl aspartyl glutamicAcid	13.309	304.0863	304.0863	C ₁₁ H ₁₆ N ₂ O ₈
23	Phthalic acid Mono-2-ethylhexyl Ester	14.238	278.1502	278.1502	C ₁₆ H ₂₂ O ₄
24	Gemeprost	14.462	394.2662	394.2662	C ₂₃ H ₃₈ O ₅
25	Hydroxyhydroquinone	14.556	126.0333	126.0332	C ₆ H ₆ O ₃
26	PGF2alpha isopropylester	14.785	396.2838	396.2838	C ₂₃ H ₄₀ O ₅
27	GlnGln Lys	15.385	402.2214	402.2214	C ₁₆ H ₃₀ N ₆ O ₆
28	2-Amino-3-hydroxy-5-nitrobenzophenone	15.977	258.0582	258.0582	C ₁₃ H ₁₀ N ₂ O ₄
29	16b-Hydroxyestradiol	16.054	288.1721	288.1721	C ₁₈ H ₂₄ O ₃
30	Leupeptin	16.067	426.2921	426.2921	C ₂₀ H ₃₈ N ₆ O ₄
31	5-Amino-6-(5'-phosphoribosylamino)uracil	17.673	354.0577	354.0583	C ₉ H ₁₅ N ₄ O ₉ P
32	3,3',5,5'-Tetra-tertbutyl-4,4'-dihydroxybiphenyl	17.987	410.3177	410.3177	C ₂₈ H ₄₂ O ₂
33	12beta-Hydroxy-3-oxo-5beta-cholan-24-oic Acid	18.535	390.2735	390.2735	C ₂₄ H ₃₈ O ₄

PGF2alpha isopropylester with dock score of -11.6 kcal/mol and it had 4H- bonds with Ala 7 (2), Asp 27, Phe 92. The drug Trimethoprim had the dock score of -10.7 kcal/mol and had 4H- bonds with Ala 7 (2), Ile 14, and Phe 92 (Table 5 and Fig. 7).

3.7. Molecular dynamic simulation

3.7.1. RMSD analysis

The complex docked structure of Dihydrofolate reductase component with 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5- phenylhydantoin was done for MD simulation to assess stability. The

RMSD values show the stability of complex structures via the examination of the RMSD plot. The equilibrium of protein and ligand are same and fluctuation of protein C alpha atoms and heavy ligand atoms were within the range 3 Å. Hence, the complex was more stable (Fig. 8).

3.7.2. RMSF analysis

Characterizing the changes in the protein chain during the simulation was done using RMSF analysis. The fluctuations of the aminoacids residues were less than all but N and C terminal residues.

Table 2
ADME properties of the LC-MS Compounds derived from KK21-2 strain.

S.No	Lead molecules	QPlog P _{o/w}	QPlogS	Qpp Caco	Qplag HERG	QPP MDCK	% of HOA	PSA	HB Donars	HB Acceptor
1	N-Ethylaniline	1.249	-2.737	70.802	-4.776	28.274	67.371	115.488	2	3.75
2	3-Pyridylacetic acid	1.273	-1.501	105.192	-2.358	55.165	70.588	63.161	1	3.5
3	Dextroamphetamine	7.599	-8.451	5378.368	-4.692	3048.574	100	30.234	2	1.5
4	Paramethasone	2.78	-2.787	2579.965	-4.836	1378.021	100	26.305	1.5	1
5	Naphthylglucuronide	-2.877	-1.668	0.05	-0.36	0.019	77.42	241.007	8.5	15.1
6	3'- Hydroxytrimethoprim	2.788	-3.308	590.366	-4.704	309.627	92.871	86.553	1	11.1
7	Umbelliferone	3.816	-5.255	41.785	-2.063	20.336	78.30	97.061	2	5.7
8	5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin	2.448	-3.544	498.896	-3.797	233.311	89.566	65.04	3	4.15
9	D-Biotin	0.875	-0.982	66.494	5.476	68.914	15.571	363.96	2	32.5
10	Dihydrodeoxystreptomycin	1.302	-3.045	25.619	-1.911	18.484	59.77	107.152	3	4.5
11	IrigeninTrimethyl Ether	1.759	-0.523	920.538	-4.459	500.453	90.297	24.988	2	1
12	Haematoxylone	-5.787	-0.389	0.055	-5.763	0.014	94.02	314.517	16	24.2
13	Hydroxycortisol	2.254	-2.961	1544.214	-4.354	791.262	100	87.814	10	7.75
14	4-Biphenylamine	-2.608	-0.787	0.132	-2.133	0.149	67.99	193.134	6.5	9.5
15	Fluorenylacetylamide	0.584	-2.934	92.18	-3.505	37.605	65.53	126.041	4	9.85
16	Phthalic acid Mono-2-ethylhexyl Ester	3.642	-3.739	5759.916	-4.799	3282.992	100	75.659	2	7
17	Gemeprost	1.28	-4.589	23.806	-4.528	16.766	59.079	172.933	1	10.5
18	Hydroxyhydroquinone	-0.818	-0.516	0.031	3.808	0.039	80.80	214.406	3.25	9.25
19	PGF2 alpha isopropyl ester	2.257	-1.651	7216.27	-4.025	4188.75	100	12.791	1	1
20	2-Amino-3-hydroxy-5-nitrobenzophenone	1.938	-3.792	191.673	-3.878	127.979	79.145	106.937	3	8.15
21	16b-Hydroxyestradiol	4.14	-5.691	293.215	-5.369	131.353	95.343	98.458	3	7.1
22	Leupeptin	6.229	-1.856	28.19	-2.24	19.996	100	101.383	3.25	4.75
23	5-Amino-6-(5'-phosphoribosylamino)uracil	3.771	-4.564	130.498	-3.505	69.64	86.888	78.334	1	4
24	3,3',5,5'-Tetra-tertbutyl-4,4'-dihydroxybiphenyl	1.28	-4.589	23.806	-4.528	16.766	59.079	172.933	1	10.5
25	12beta-Hydroxy-3-oxo-5beta-cholan-24-oic Acid	0.709	-1.42	623.261	-3.749	296.765	81.115	63.234	1	3.25

QPlogP_{o/w}-Octanol/water partition coefficient, **QPlogS**-Water solubility, **QPPCaco** = Predicted apparent Caco-2 cell permeability in nm/sec, **QPlogHERG** = Predicted IC50 value, **QPPMDCK** = Predicted apparent MDCK cell on 0 to 100% scale. % of HOA = <25% **PSA** = Van der Waals surface area of polar nitrogen and oxygen atoms, **HD**- Hydrogen bond Donor, **HA**- Hydrogen bond Acceptor.

Table 3
Predicted Binding site residues of *Staphylococcus aureus*.

S.No	Targets	Active site residues
1	Dihydrofolate reductase	L5, V6, A7, I14, I15, G16, F17, N18, N19, Q20, P22, W23, L24, L25, D27, D28, K30, H31, M43, G44, R45, T46, S49, S50, P54, R58, V62, L63, T64, F92, F93, G94, G95, Q96, T97, L98, E101, I111, G120, T121, T122

The residues from the region of 62–75 were slightly fluctuated but not the above the range of 3 Å (Fig. 9).

3.7.3. Protein-ligand interactions

There are four different forms of protein–ligand interactions: hydrogen bonds, hydrophobic bonds, water bridges and ionic bonds. Since they have an impact on drug selectivity, metabolization, and adsorption, H-bonds are crucial in the design of pharmaceuticals (Abuthakir et al., 2021). The complex structure of the histogram of Dihydrofolate reductase with 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin demonstrates the presence of a strong hydrogen bonded between the ligand and binding site, essential residues. The residues Ala 07, Ile 14, Thr 46, Phe 92, Gln 95 and Thr 121 were involved in the hydrogen bond interactions, Leu 20 and Ile 50 were in hydrophobic contacts and water bridges with Ala 7, Asn 18 and Asp 120 (Fig. 10).

From the Timeline representation, the residues Ala 07, Ile 14, Asn 18, Phe 92, Gln 95, Asp 120 and Thr 121 maintained the interactions with maximum time during the entire simulation period. The 2D image of complexed structure shows that the residues Ala 07, Ile 14, Asn 18, Phe 92, Gln 95 were maintained the interactions 80%, 85%, 75%, 98% and 85%, respectively of entire simulation period (Fig. 11). The 2D structure of the interaction of Dihydrofo-

late reductase protein with 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin is mentioned below in (Fig. 12).

4. Discussion

In the United States, cellulitis is a common bacterial skin illness that affects about 14 million people each year. It accounts for 3.7 billion in outpatient treatment expenses and 650,000 hospitalizations annually (Raff and Kroshinsky, 2016). Cellulitis is a deep skin infection with sore region of redness, resulting in fever for which early care with oral or intravenous antibiotics is suggested (Gabillot-Carre and Roujeau, 2007). In the present study, the targets of the pathogens causing this disease were selected and new drug / lead molecules have been identified from the compounds of soil actinomycetes by docking analysis using Glide software.

Staphylococcus aureus and *Streptococcus pyogenes* are the main pathogens involved in the Cellulites disease (Gunderson and Martinello, 2012). The 3D structure of the *S.aureus* target Dihydrofolate reductase was retrieved from PDB database. Some other targets are Dihydropteroate synthase, Penicillin binding protein 2a, Thymidylate synthase, 23 s rRNA subunit Methyltransferase these are already proven targets for the cellulites diseases. Folate metabolism inhibitors are widely acknowledged as potent treatments for rheumatoid arthritis, bacterial infections, and cancer. DHFR is a crucial enzyme for the metabolism of DNA, RNA and amino acids (Luo et al., 2006). One such protein, dihydrofolate reductase, has been a major antibacterial and anticancer therapeutic target because of its crucial function in nucleotide production.

Through LC-MS analysis of the aqueous extract, 33 compounds have been identified of which 25 compounds were subjected to ADME analysis after excluding 8 compounds that didn't obey Lipinski's rule and amino acids which may be from the broth component. All the 25 ligands selected from LC-MS analysis were docked

Table 4
XP docking results of LC-MS derived compounds with Dihydrofolate reductase of *Staphylococcus aureus*.

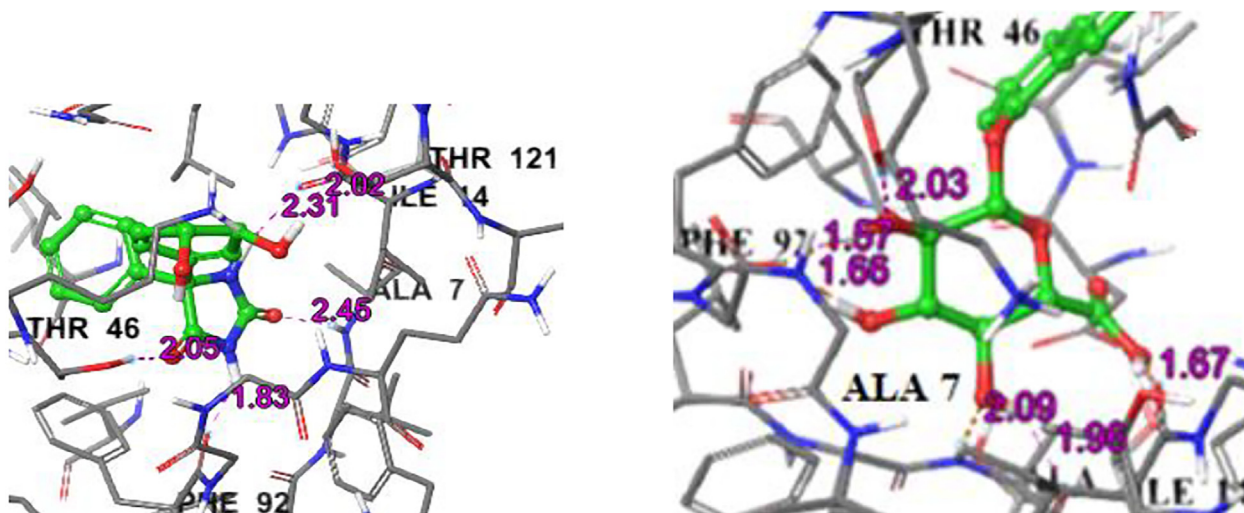
S.No	Compounds	Dock score (kcal/mol)	H- bonds	Bond length (Å)
Compounds				
1	5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin	-10.3	Ala 7 (N-H), Ile 14 (O-H) Ser 49 (O-H)	2.14 2.43 2.48
2	PGF2alpha isopropylester	-10.0	Ala 7 (N-H) Leu 24 (N-H) Asp 27 (O-H), Thr46 (O-H)	2.01 2.13 2.39 2.26
3	Naphthyl glucuronide	-9.2	Leu 5 (O-H) Asp 27 (O-H) Phe 92 (O-H)	1.97 1.70 1.81
4	D-Biotin	-8.5	Ala 7 (N-H) Ile 14 (O-H) Asn 18 (O-H)	2.11 2.11 2.06
5	16b-Hydroxyestradiol	-8.3	Asp 27 (O-H) Ser 49 (O-H)	1.82 2.02
6	Hydroxycortisol	-8.1	Val 6 (O-H) Asp 27 (O-H)	2.02 2.18
7	Paramethasone	-7.8	Asp 27 (O-H)	2.09
8	Gemeprost	-7.8	Ala 7 (N-H) Leu 24 (N-H) Thr 46 (O-H)	2.40 2.15 2.13
9	3'-Hydroxytrimethoprim	-7.4	Leu 5 (O-H) Asp 27 (O-H) Asp 27 (O-H) Phe 92 (O-H)	1.86 2.13 2.07 1.71
10	12beta-Hydroxy-3-oxo-5beta-cholan-24-oic Acid	-7.0	-	-
Drug				
	Trimethoprim	-7.4	Leu 5 (O-H) Asp 27 (O-H) Asp 27 (O-H) Phe 92 (O-H)	1.91 2.15 2.09 1.69

Table 5
Induced Fit Docking analysis of compounds selected from XP Docking with Dihydrofolate reductase of *Staphylococcus aureus*.

S.No	Compounds	Dock score (kcal/mol)	H- bonds	Active site Residues	Bond length (Å)
Compounds					
1.	5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin	-12.8	Ala 7 (H-O) Ile14(O-H) Thr 46 (H-O) Phe 92 (O-H) Thr 121 (O-H)	Ala 7 Ile 14 Thr 46 Phe 92 Thr 121	2.45 2.31 2.05 1.83 2.02
2	Naphthyl glucuronide	-12.0	Ala 7 (H-O) Ala 7 (O-H) Ile 14 (O-H) Thr 46 (H-O) Phe 92 (O-H) Phe 92 (O-H)	Ala 7 Ile 14 Thr 46 Phe 92	2.09 1.96 1.67 2.03 1.66 1.57
3	PGF2alpha isopropyl ester	-11.6	Ala 7 (H-O) Ala 7 (O-H) Asp 27 (O-H) Phe 92 (O-H)	Ala 7 Asp 27 Phe 92	2.05 1.73 2.05 2.22
Drug					
	Trimethoprim	-10.7	Ala 7 (O-H) Ala 7 (H-O) Ile 14 (O-H) Phe 92 (O-H)	Ala 7 Ile 14 Phe 92	1.82 2.10 1.89 2.06

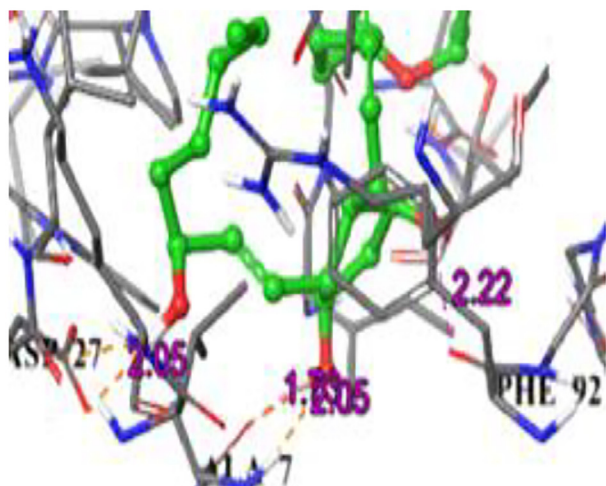
with the target first in XP docking and top 3 from XP results were subjected to IFD and compared with corresponding drugs. The H-bond, ionic bond, hydrophobic bond and water bridges are the four important interactions of the protein- ligand docking of which the interaction between H-bonds is significant because of its effect on the drug specificity (Wade and Goodford, 1989).

More powerful DHFR inhibitors have recently been created through the use of structure-based design, and they are effective and selective against *Staphylococcus aureus* (Lam et al., 2014). Dihydrofolate reductase, is the primary enzyme that produces the cofactors, essential for controlling the metabolism of folate (Schnell et al., 2004). Dihydrofolate reductase is very important

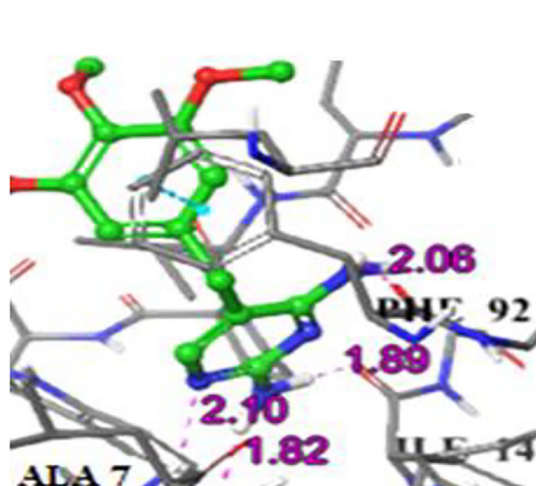


(a) 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-Phenylhydantoin

(b) Naphthylglucuronide



(c) PGF2alpha isopropyl ester



(d) Trimethoprim

Fig. 7. IFD complex structure of Dihydrofolate reductase with compounds and Trimethoprim drug.

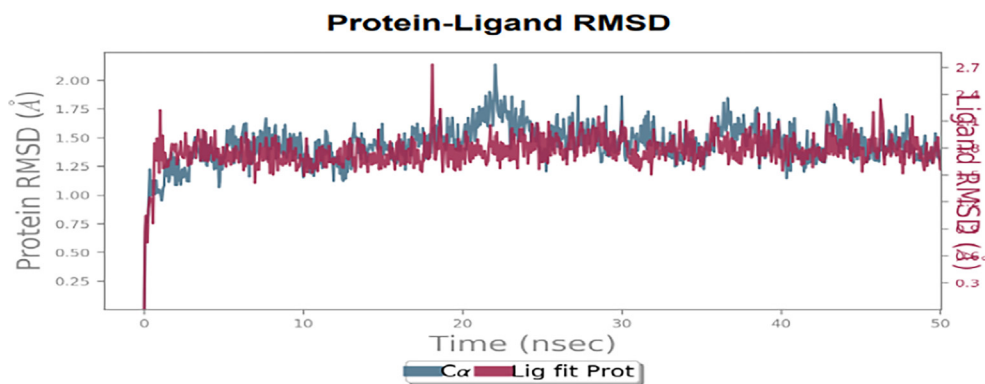


Fig. 8. RMSD plot of the docked complex structure of Dihydrofolate reductase protein with 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5- phenylhydantoin.

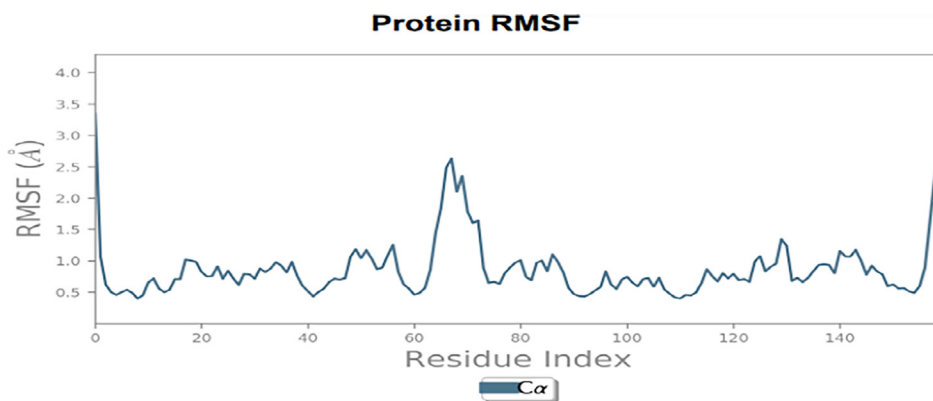


Fig. 9. RMSD plot of Dihydrofolate reductase protein with 5-(3,4-Dihydroxy-1,5 cyclohexadien-1-yl)-5- phenylhydantoin.

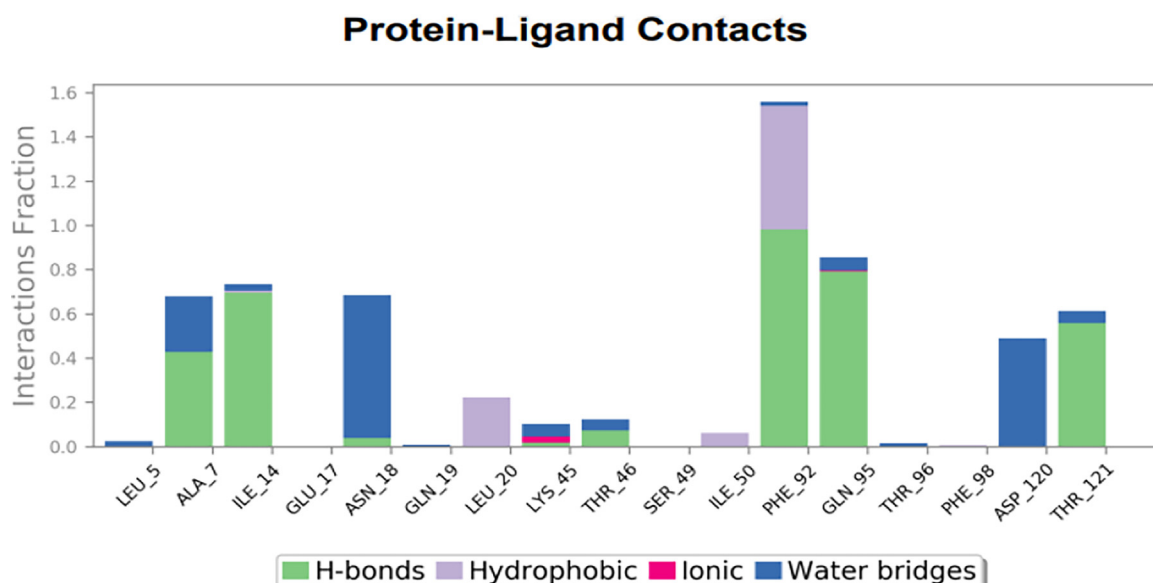


Fig. 10. Graph illustrating the interactions between proteins and ligands in a docked complex structure of Dihydrofolate reductase protein with 5-(3,4-Dihydroxy-1,5 cyclohexadien-1-yl)-5- phenylhydantoin.

in Dihydrofolate pathway as it has several roles (Fischer et al., 2010) and one of this is converting dihydrofolate to tetrahydrofolate thereby involved in purines and thymidylate synthesis (Lin and Gerson, 2014).

The active site residues of *S.aureus* Dihydrofolate reductase are Val 6, Ala 7, Leu 20, Pro 25, Asp 27, Leu 28, Val 31, Ser 49, Ile 50, Arg 57, Phe 92, and Thr 111 (Kobayashi et al., 2014). The IFD results of the present study showed all the top 3 compounds, viz. 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin (-12.8 kcal/mol), Naphthyl glucuronide (-12.0 kcal/mol) and PGF2alpha isopropyl ester (-11.6 kcal/mol) had lesser dock score than the drug Trimethoprim (-10.7 kcal/mol). The complex structure of the Dihydrofolate reductase with the 3 LC-MS compounds and the drug Trimethoprim showed the H-bond interactions with Ala 7, Tyr 121 which are the active site residues reported by Kobayashi et al. (2014). With an four helices and eight-stranded sheet providing the place where substrate and cofactor are bound, The conserved fold shown in previously published crystal structures of

DHFR from different species is maintained by the DHFR from the bacterium aureus. (Heaslet et al., 2009).

From the other targets the IFD results of the Dihydropteroate synthase, the selected compounds 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin dock score was -8.1 kcal/mol and Naphthyl glucuronide dock score was -8.1 kcal/mol. This inhibitor is already known inhibitor for the cellulitis diseases and the corresponding drug sulfamethoxazole is -4.3 kcal/mol.

According to the Molecular Dynamics simulation study, the complex structure of Dihydrofolate reductase protein with 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5 phenylhydantoin was stable and active site residues are Ala 07, Ile 14, Asn 18, Phe 92, Gln 95 interacted. Based on the Molecular Dynamic Simulation study 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl) phenylhydantoin have suggest that this compound having antibacterial activity against the cellulitis skin disease for the pathogen *Staphylococcus aureus*. The compound 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin is an organic compound. The present study

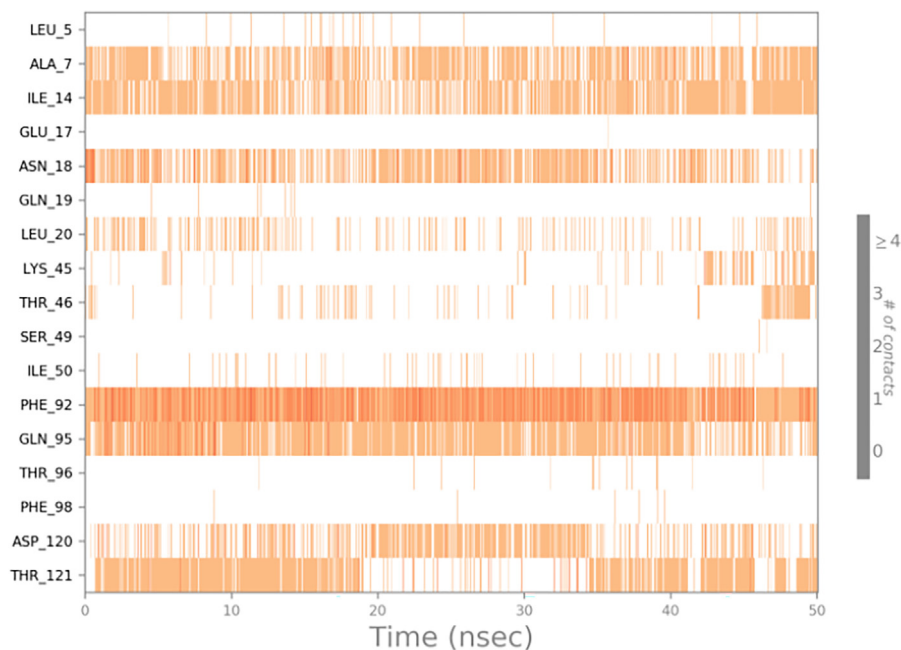


Fig. 11. Timeline representation of complex of Dihydrofolate reductase protein with 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5- phenylhydantoin.

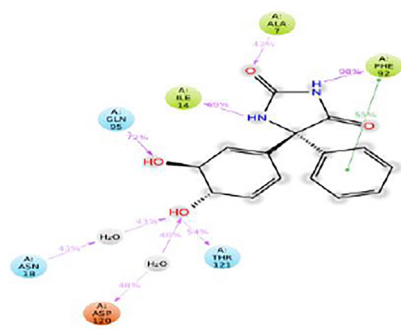


Fig. 12. 2D structure of interaction of Dihydrofolate reductase protein with 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5- phenylhydantoin.

conclude that the soil actinomycetes are rich source of antibiotics, the mentioned compound is a novel compound to the cellulitis diseases for the drug development.

5. Conclusion

The therapeutic target of DHFR inhibitors for cellulitis skin diseases was investigated using molecular docking studies. Many studies have been conducted on DHFR as a potential target for antimicrobial medicines. Of all the compounds, 5-(3,4-Dihydroxy-1,5-cyclohexadien-1-yl)-5-phenylhydantoin produced very significant docking results with all the selected target of *S.aureus* suggesting the possibility of broad spectrum multi-targeting efficacy, hence can be considered for further *in vitro* and *in vivo* testing for cellulitis diseases.

Declaration of Competing Interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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Appendix A. Supplementary material

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.jksus.2023.102762>.

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