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Identification of Pyrazole Derivatives of Usnic Acid as Novel Inhibitor of SARS-CoV-2 Main Protease Through Virtual Screening Approaches

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Abstract

The infection produced by the SARS-CoV-2 virus remains a significant health crisis worldwide. The lack of specific medications for COVID-19 necessitates a concerted effort to find the much-desired therapies for this condition. The main protease (M^{pro}) of SARS-CoV-2 is a promising target, vital for virus replication and transcription. In this study, fifty pyrazole derivatives were tested for their pharmacokinetics and drugability, resulting in eight hit compounds. Subsequent molecular docking simulations on SARS-CoV-2 main protease afforded two lead compounds with strong affinity at the active site. Additionally, the molecular dynamics (MD) simulations of lead compounds (17 and 39), along with binding free energy calculations, were accomplished to validate the stability of the docked complexes and the binding poses achieved in docking experiments. Based on these findings, compound 17 and 39, with their favorable projected pharmacokinetics and pharmacological characteristics, are the proposed potential antiviral candidates which require further investigation to be used as anti-SARS-CoV-2 medication.

Keywords SARS-CoV-2 \cdot Pyrazole derivatives of Usnic acid \cdot ADMET \cdot Drug-likeness \cdot Docking \cdot Molecular dynamics simulation

Introduction

Viral respiratory infections in humans are mainly caused by Coronaviruses (CoVs). The SARS coronavirus (SARS-CoV) and MERS-CoVs are the most virulent types transmitted to humans from animals and could lead to mild to severe respiratory infections. These two sparked global epidemics during the last twenty years, with very high mortality rates

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in 2003 and 2012 [1]. In December 2019, swiftly dispersing cases of pneumonia disease were discovered in Wuhan city of China [2], which was caused by a novel coronavirus strain that was identified later. This strain has an 82% similar positive-stranded RNA genome to that of the SARS-CoV, a clade of the beta-coronavirus, named SARS-CoV-2 [3, 4]. A big replicase gene encompassing non-structural proteins is found in the genome, followed by structural and auxiliary genes [5]. Both polyprotein 1a and polyprotein 1b (pp1a and pp1b), which are eventually transformed into mature

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non-structural proteins by main protease (M^{pro}) and papainlike proteases, are encoded by the first of the two open reading frames (ORFs) of the replicase gene. These enzymes are essential for viral replication and transcription [6, 7]. SARS-CoV-2 possesses a large number of structural and non-structural proteins. The crystal structure of the M^{pro} or chymotrypsin-like protease (3CL^{pro}) from SARS-CoV-2 was successfully constructed by Liu et al. [8]. The M^{pro} protein is also crucial for viral proteolytic maturation. Thus, M^{pro} could be a potential and effective therapeutic target for the novel coronavirus disease by inhibiting the polypeptide cleavage of SARS-CoV-2.

The World Health Organization (WHO) formally called the disease COVID-19 on February 11th, 2020 [9], and essentially declared a pandemic on March 11th, 2020, as the virus spread exponentially over the globe [10]. According to the situation report, there are 509,854,571 cumulative confirmed cases worldwide, with 6,244,664 deaths as of April 26th, 2022 [11]. Pfizer's antiviral Paxlovid, a protease inhibitor, got the emergency US Food and Drug Administration (FDA) approval to administer to COVID-19 patients on December 22nd, 2021. However, its associated drug-drug interactions may limit its use in the community [12]. Furthermore, a few vaccines are on the market to combat this lethal viral infection. Some studies support using traditional medicines as alternative and adjuvant therapies in SARS-CoV-2 disease. So, continuous efforts are still ongoing to integrate western medications and traditional medicines for devising proper therapeutic strategies [13]. Antiviral therapies have been demonstrated to be effective against viral enzymes. As a result, most antiviral drugs have been used for SARS-CoV-2 treatment at the start of a diagnosis [14]. Since January 2020, numerous clinical trials have been conducted on antiviral, anti-inflammatory, and antimalarial medications for managing COVID-19 disease [15, 16].

The best source of therapeutic compounds is natural products with anticancer [17, 18], antiviral [19], antibacterial [18], antioxidant [20], and anti-inflammatory [21] properties, as well as anti-herbivoral activity [22]. Lichens have traditionally been utilized for various illnesses in many cultures and are a potential source of novel antiviral agents [23, 24]. A lichen-derived secondary metabolite Usnic acid (UA), shows a unique range of bioactivity, including activity against several gram-positive bacteria such as Staphylococcus epidermidis, Staphylococcus aureus, Enterococcus faecalis, Mycobacterium tuberculosis, and several pathogenic fungi. When used in polyurethanes or bone cement, it has recently been proven to suppress biofilm formation by Staphylococcus spp. [25, 26]. As a result, this molecule is thus being investigated as a potential agent to be adsorbed onto the surface of medical devices as a substitute for conventional antibiotics to prevent bacterial infections caused by medical equipment. Furthermore, this compound has anti-parasitic [27], anti-inflammatory [28], antiviral [29], anti-nociceptive, anti-mycotic [27], and anesthetic [30] activities. The anti-tumor action of UA was initially discovered in mice with lung cancer and P388 leukemia [31]. Furthermore, based on the docking result by Prateeksha et al. [32] which exhibited the ability of UA to inhibit the interaction between the viral receptor binding domain (RBD) of trimeric spike glycoprotein (SGP) with the host angiotensinconverting enzyme-2 (ACE-2) [32] suggests its therapeutic potentiality against SARS-CoV-2.

Thus, the research objective was to use *in-silico* techniques to find novel pyrazole derivatives of UA as potential anti-SARS-CoV-2 lead compounds. A total of 50 pyrazole derivatives of UA (Table S1) were initially obtained from the literature. Following that, drug-likeness and ADMET screening was performed, and eight compounds were chosen based on their pharmacokinetic features. These were then subjected to molecular docking against SARS-CoV-2 main protease (M^{pro}), which yielded two lead compounds (Table 1) compared to the reference compound (Co-crystallized ligand, 11a). The resultant compounds were further subjected to molecular dynamics (MD) simulation to estimate the docking accuracy and binding stability.

Methodology

Drug-Like Properties and ADMET Study

Several predictors were used to characterize the side effects and potency of the selected ligands (Table S1) as drugs, including Lipinski's rule of five (Molecular weight, LogP, Hydrogen bond acceptor and donor, and Topological polar surface area) and ADMET properties (Aqueous solubility, Human intestine absorption, Blood–brain barrier, CYP substrate inhibitor, hERG inhibitor, and hepatotoxicity). The online tool pkCSM (http://biosig.unimelb.edu.au/pkcsm/) was used to evaluate the pharmacokinetic variables [33] of both ligands and standard (Co-crystallized ligand, 11a) molecules.

Structure-Based Screening

The crystal structure of SARS-CoV-2 M^{pro} with the PDB code 6LZE was used as the target protein for docking [34, 35]. The CB-Dock (Cavity-detection guided Blind Docking) tool was used for protein–ligand docking [36, 37] of eight pyrazole derivatives of UA (obtained from drug-likeness and ADMET screening) with the M^{pro} target. These ligands were acquired from several literature sources, generated with the ChemSketch tool, and saved in.mol format. The CB-Dock protein–ligand docking tool quickly locates the binding region, calculates the center's size and location,

Compound number	Molecular structure	IUPAC name	Chemical formula	Molecular weight (g/ mol)
17		(R)-8-acetyl-5,7-dihydroxy-3,4a,6-trime- thyl-1-(6-methylpyridazin-3-yl)-1,4a- dihydro-4H-benzofuro[3,2-f]indazol- 4-one	$C_{23}H_{20}N_4O_5$	432.436
39		1-((4R,4aS)-4,5,7-trihydroxy- 3,4a,6-trimethyl-1-phenyl-4,4a- dihydro-1H-benzofuro[3,2-f]indazol-8-yl) ethan-1-one	$C_{24}H_{22}N_2O_5$	418.449

Table 1 Structure, IUPAC name, chemical formula, and molecular weight of newly discovered small-molecule inhibitors (17 and 39)

customizes the docking zone's size depending on the input molecules, and then docks with AutoDock Vina version 1.1.2 [38]. Before docking, a PBD file of the receptor and a.mol file containing the ligands were entered into the CB-Dock program. Throughout this method, several top cavities were automatically selected and used for further docking analysis. The ideal binding posture is considered the first conformation, and the associated location is regarded as the best binding site for the query ligand. After examining the binding modalities, interaction with active site residues, and the docking score, the best-docked poses were selected for additional testing compared to the reference compound (Cocrystallized ligand, 11a). The co-crystallized ligand (11a) was selected as reference compound and 11a exhibited high SARS-CoV-2 Mpro inhibition activity with the IC50 value of $0.053 \pm 0.005 \mu$ M. Moreover, this compound showed good PK properties in vivo, and also exhibited low toxicity [34].

MD Simulation and Binding Free-Energy Calculations

The stability of the docked compounds at the M^{pro} enzyme's active site was evaluated by running all-atom MD simulations. While ligand charge calculations were carried out using the bcc method, the topology of Mpro and the screened ligands were created using AMBER99SB and GAFF force-fields, respectively [39]. The protein–ligand complexes were solvated in cubical boxes filled with TIP3P water molecules and then neutralized the system with sufficient Na + and Cl- ions. The distance between the two periodic images was maintained at 2 nm. The systems underwent a 2000-steps steepest descent energy minimization process, followed by a 100-step conjugate gradient energy minimization and subsequently equilibrated for 1 ns each under NVT and NPT ensembles at 310.15 K and 1 bar using modified Berendson thermostat and Parinello-Rahman barostat, respectively. These equilibrated systems were then subjected to production runs of 100 ns each at the same temperature and pressure. A 2 fs time-step was applied while the frames were updated every 1 ps. Standard GROMACS tools were used for the trajectory analysis, and PyMol was used for viewing the trajectories.

The end-state MMPGSA binding free energy calculations were done using the gmx_MMPBSA v.1.5.2 tool [40]. All the 10,000 frames were taken for binding free energy calculations with the internal and external dielectric constants of 1 and 80, respectively, while iGB model 2 was selected for the analyses. The interaction entropy was calculated for the last 250 frames. The binding free energy is defined by Eq. 1:

$$delG_{gas} + delG_{solv} = delG_{total},$$
(1)

where $delG_{gas}$ constitutes the gas phase binding energy contributions, including electrostatic and van der Waals interactions, $delG_{solv}$ marks the solvation free energy contribution, and $delGt_{otal}$ represents the total binding free energy.

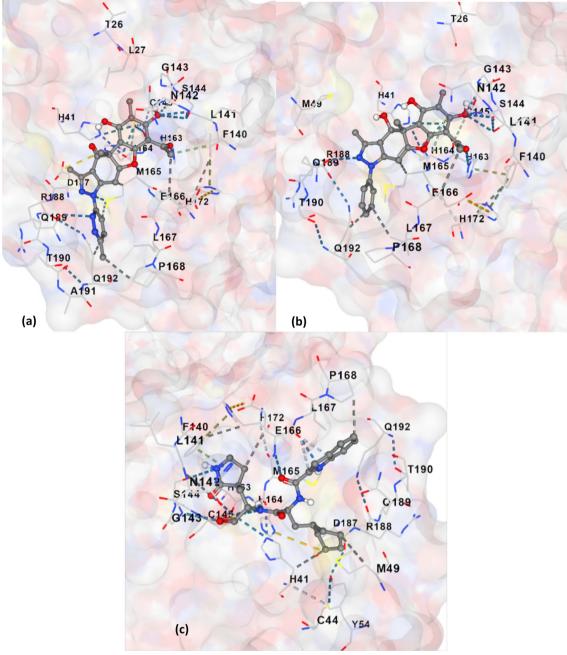


Fig. 1 3D-Interaction diagram of A compound 17, B compound 39 and C Co-crystal ligand 11a with the active site amino acid residues of SARS-CoV-2 main protease

The metadynamics analysis of the trajectory data, including the free energy landscape (FEL), principal component analysis (PCA), cumulative variance, porcupine plot, and secondary structure changes, were estimated using geo_ measures 0.9 PyMol plugin [41].

Results and Discussion

Drug-Like Properties and ADMET Study

The pharmacokinetic profiles were also calculated for the compounds and the co-crystal ligand (11a). Several predictors, including Lipinski's rule of five and ADMET, were used to characterize these ligands' side effects and potency as drugs. The pkCSM program generates small-compound

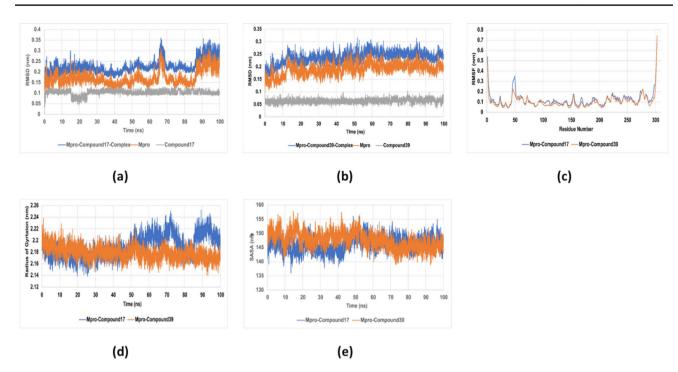


Fig.2 RMSD plot of individual ligands (a, b) (grey), protein (red) and complex (blue), c RMSF of complex (blue colour-M^{pro}-compound17 and red colour- M^{pro}-compound-39), d RoG of complex

(blue colour- M^{pro} -compound17 and red colour- M^{pro} -compound-39) and **e** SASA of complex (blue colour- M^{pro} -compound17 and red colour- M^{pro} -compound-39)

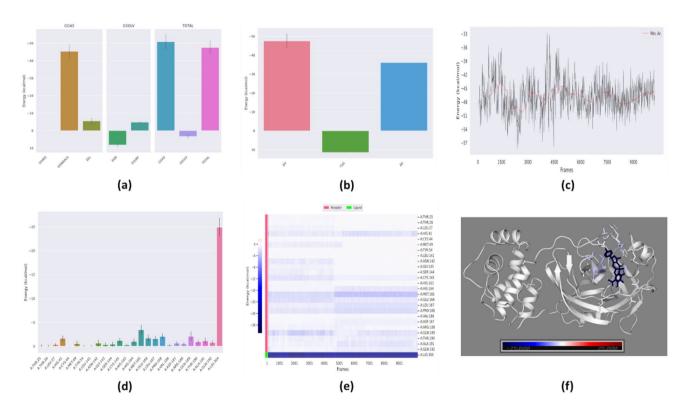
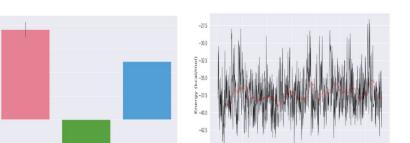


Fig. 3 The binding energy analysis between M^{pro} and compound-17. a Enthalpic contributions, b Total binding energy, c Per-frame binding energy values, d Per-residue energy decomposition, e Per-frame

per-residue energy decomposition plot, f 3D representation of energy decomposition of M^{pro} interacting residues with compound 17



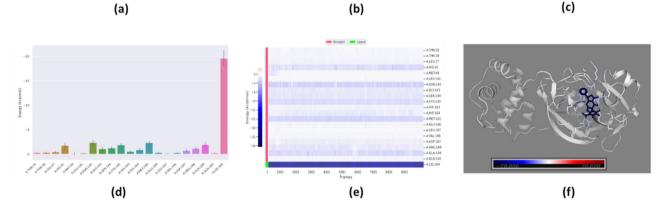


Fig. 4 The binding energy analysis between M^{pro} and compound-39. a Enthalpic contributions, b Total binding energy, c Per-frame binding energy values, d Per-residue energy decomposition, e Per-frame

per-residue energy decomposition plot, **f** 3D representation of energy decomposition of M^{pro} interacting residues with compound-39

pharmacokinetic profiles based on the compilation of QSAR model databases. Table S2 displays the outcome of this prediction.

According to Lipinski's rule of five, a drug's oral bioavailability is determined by various factors. The drug must have a molecular weight of less than 500 g/mol, a log P (octanol-water partition coefficient) value of less than 5, hydrogen bond donors (-NH or -OH groups) of less than 5, and hydrogen bond acceptors (N or O atoms) of less than 10. For better intestinal absorption of a small-molecule, its topological polar surface area (TPSA) should be less than 140 Å² and rotatable bonds of less than or equal to 10. Only eight compounds (1, 5, 6, 7, 17, 18, 33, and 39) out of 50 investigated pyrazole derivatives of UA agree with Lipinski's rule of five (Table S2), constituting potential orally administered medicines.

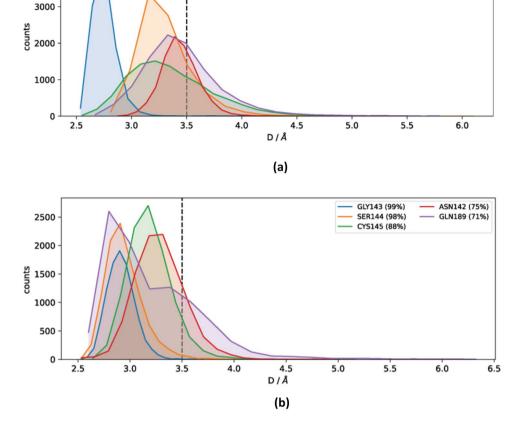
However, the drug must possess good ADMET (absorption, distribution, metabolism, excretion, and toxicity) qualities at the therapeutic dose. All pyrazole derivatives of UA have aqueous solubility and good human intestine absorption characteristics (Table S2). The blood-brain barrier (BBB) has a moderate distribution of all substances. Furthermore, cytochrome P450 (CYP450) enzymes are required to metabolize numerous xenobiotics in humans and metabolize 90% of all medications. There are two pharmacological interactions with CYP450: enzyme inhibition and induction. CYP450 inhibitors block this enzyme's metabolism, whereas CYP450 inducers can act as a substrate for metabolic activities or synthesize more enzymes [42]. Because they do not exhibit toxicity for the isoform of the CYP substrate and CYP inhibitor, the compounds (1, 5, 6, 7, 17, 18, 33, and 39) demonstrate excellent metabolism. Finally, unlike hERG I inhibitors, these drugs do not have toxicity. The hERG (human ether-á-go-go related gene) encodes a potassium ion channel that supports electrical heart activity by repolarizing the cardiac action potential [43, 44]. When drug molecules block this channel, the result can be an arrhythmia, which can cause possibly fatal symptoms. [45]. The hERG I inhibitor predictor revealed that compounds 1, 5, 6, 7, 17, 18, 33, and 39 had little inhibiting ability of this channel, demonstrating their eligibility as therapeutic candidates. This software was also used to predict the hepatotoxicity potential of the selected ligands. According to the findings, all ligands can potentially cause liver injury.

Structure-Based Screening

The eight compounds, as mentioned earlier, were subjected to more thorough screening on the CB-Dock server [36]. A wide range of binding affinities of the ligands with the main **Fig. 5** The number of contacts and their corresponding frequency (51–99%), formed between the ligands and the active site residues of M^{pro} within 3.5 Å of the ligands. **a** M^{pro} -compound 17, **b** M^{pro} -compound-39

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protease were obtained during screening. Based on the interaction energy and interacting amino acid residues relative to the reference compound (co-crystal ligand 11a = -8.4 kcal/ mol), the two best compounds (17 = -8.9 kcal/mol and 39 = -8.7 kcal/mol) Table 1, which exhibited the similar binding energy and interaction profiles with main protease to that of co-crystal ligand were chosen for future study.

The Usnic acid analogues showed the docked score values on main protease, ranging from -8.4 to -9.7 kcal/mol (Table S3). Figure 1 shows the CB-Dock output data analysis results for selected ligands. Compound 17 was chosen for binding because of its hydrophobic, hydrogen bonding, ionic bonding, and π - π stacking interactions (hydrophobic: Gln192, Pro168, Met165, Phe140, and Glu166; hydrogen bonding: Thr190, Arg188, Met165, Gln189, Cys145, His164, His41, His163, and Leu171; ionic bonds: His164 and His172; π - π stacking: Phe140) (Table S3). Compound-39 had lower binding energy than compound 17, despite having strong hydrophobic, hydrogen bonding, ionic, and π - π stacking interactions (hydrophobic: Gln192, Leu167, Phe140, and Glu166; hydrogen bonding: Thr190, Arg188, Gln189, Met165, His164, Cys145, Leu141, His163, and His41; ionic bond: His172; π - π stacking: Phe140). On the other hand, compounds 1, 5, 6, 7, 18, 22, and 33 revealed a high number of hydrophobic and hydrogen bond formations with a few similar amino acid residues (Table S3) at the same binding site as Compound 17 and 39. According to the foregoing findings, the ionic and π - π stacking interactions, in addition to hydrogen bonding and hydrophobic interaction, played a crucial part in Compound 17 and 39's high binding affinities compared to other molecules.

MD Simulation

Analysis of Structural Changes and Fluctuations in M^{pro}

The dynamic behaviors of the screened molecules and their stability at the active site of M^{pro} were assessed by analyzing their MD trajectories. The root mean square deviation (RMSD) of the individual ligands, protein and complex were calculated and plotted as shown in Fig. 2a and b. Both the systems were well equilibrated within the first 10 ns of the trajectories. In the case of compound 17, the RMSD of the M^{pro} -compound 17 complex ranged from 0.20 to 0.35 nm, with a similar trend of RMSD for protein from 0.15 to 0.3 nm. The system remained stable from the last 15 ns.

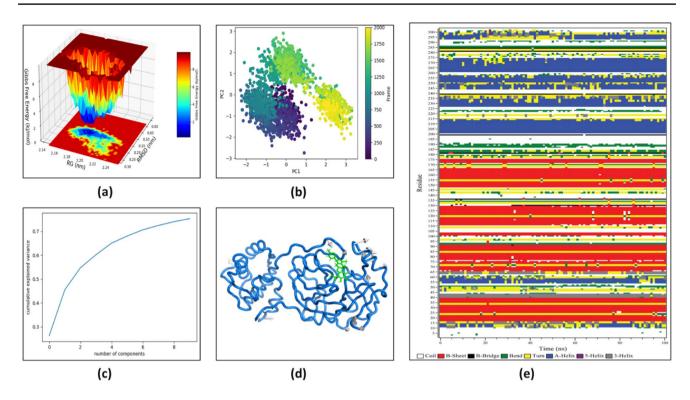


Fig. 6 Metadyamics analysis of M^{pro} -Compound17 trajectory. **a** Free energy landscape, **b** PCA plot, **c** cumulative variance explained by the first top 10 components, **d** porcupine plot and **e** Changes observed

in the secondary structure around the active site residues of M^{pro} in complex with compound $17\,$

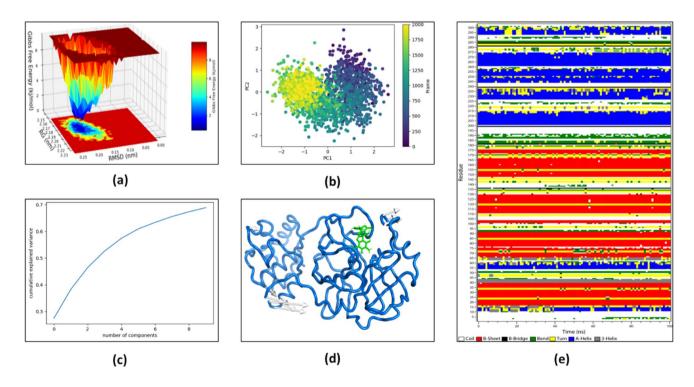


Fig. 7 Metadyamics analysis of M^{pro} -Compound39 trajectory. a Free energy landscape, b PCA plot, c cumulative variance explained by the first top 10 components, d porcupine plot and e Changes observed

in the secondary structure around the active site residues of M^{pro} in complex with compound-39 $\,$

In comparison, compound 17 showed small fluctuations in RMSD at around 15–24 ns and then remained stable throughout the trajectory with RMSD of 0.11 nm in the case of M^{pro}-compound 39 complex, the RMSD fluctuated from 0.2 to 0.31 nm and remained stable throughout the trajectory. A similar trend of RMSD was seen for M^{pro}. Compound 39 remained steady the entire trajectory with an average RMSD of 0.07 nm. The average fluctuations in the amino acid residues of the protein as a result of ligand binding over the simulation period were assessed by calculating the root mean square fluctuations (RMSF), as evident in Fig. 2c. The RMSF of the residues ranged from 0.05 to 0.75 nm, with the highest fluctuation observed in the terminal residues, which is expected owing to their flexible nature. The minimal fluctuations were observed in the active site residues ranging from 0.05 to 0.12 nm, indicating the stable interactions between the M^{pro} and compounds 17 and 39. The structural changes in M^{pro} were calculated in terms of the radius of gyration of the protein (RoG). Figure 2d shows the RoG of M^{pro} in complex with compound 39 ranged from 2.22 to 2.16 nm and maintained its shape, while M^{pro} in complex with compound 17 showed slight expansion of the structure by the last 50 ns of the trajectory with the RoG values ranging up to 2.25 nm. The solvent accessible surface area (SASA) for the M^{pro} in the presence of ligands remained more or less similar by the end of the simulation for both cases, as shown in Fig. 2e.

Binding Energy Estimations

The end-state relative binding free energies (MMGBSA) between the M^{pro} and compounds 17 and 39 were calculated to assess the stability of these ligands at the active site of M^{pro}. Compound 17 showed a relatively lower binding energy $(-36.11 \pm 3.76 \text{ kcal/mol})$ with M^{pro} as compared to compound 39, which showed a binding energy of $-24.72 \pm 3.20 \text{ kcal/mol}$, which indicated a relatively higher affinity of compound 17 towards M^{pro} than compound 39 (Figs. 3a–c and 4a–c) with the major interactions being van der Waals interactions.

The catalytic dyad of M^{pro} consists of the residues His41 and Cys145. For the M^{pro} to be catalytically active, it stays in a homodimeric form, where the residue Glu166 of one protomer interacts with the N-terminal residues of other protomer [3, 46]. Additionally, side chain of Glu166 and His163 along with backbone of Phe140 plays a critical role in peptide substrate recognition and binding. Along with these residues, there are three conserved histidine residues (His163, His162 and His172) that are part of the substrate binding site of M^{pro}. Among these, a mutagenesis study has shown that residues His163 and His172 are critical to maintain the enzymatic activity [47, 48].

In our study, the highest contribution to the binding free energy of M^{pro} with compounds 17 and 39 was made by active site residues Asn142, Gly143, Ser144, His163, His164, Met165, Glu166, Arg188, and Gln189 along with the catalytic dyad residues His41 and Cys145 (Figs. 3d and 4d) which remained stable over the trajectories as shown in Figs. 3e and 4e. These residues also maintained contact with the ligands well under 3.5 Å, with the frequency ranging from 51 to 99%, as shown in Fig. 5. Since, all these residues are critical for dimerization of M^{pro}, peptide substrate recognition, binding and catalysis, hence, binding of compounds 17 and 39 with M^{pro} might interfere with the active homodimer formation, substrate binding and enzymatic catalysis by M^{pro} thereby inhibiting its biological function crucial for SARS-CoV-2 replication.

The Metadynamics Analysis of the Trajectories

The different conformational ensemble states adopted by the protein M^{pro} after binding the compounds 17 and 39 were estimated by plotting the free energy landscapes (Figs. 6a and 7a). A single energy minimum was observed in both cases where the energy minima in the case of compound 17 are more broadened and contain more different ensemble states of the protein compared to FEL of M^{pro} in complex with compound 39 (Figs. 6a and 7a), which is also supported by the PCA analysis and cumulative variance plot where the conformational search spanned by protein in complex with compound 17 is more along both the principal components compared to that in complex with compound 39 (Figs. 6b and 7b) and the cumulative variance explained by the first top 10 components in case of compound 17 is more (78%) as compared to that in case of compound 39 (Figs. 6c and 7c). The slight expansion in the radius of gyration of M^{pro} in complex with compound 17 as compared to complex 39 can also be explained by the outward movement of the alpha-helical fragment over the active site mapped by the residues 46-56 as displayed in the porcupine plot in Figs. 6d and 7d. The changes in the per residue-wise secondary structure of the M^{pro} as a function of screened ligand binding were also assessed. In both cases, no significant changes were observed in the secondary structure around the active site residues (Figs. 6e and 7e).

Conclusions

In conclusion, two novel small compounds that have substantial inhibitory potential against the binding of the M^{pro}, the primary factor responsible for viral infection and replication, were discovered in this work. The newly discovered compounds outperformed the standard (co-crystallized ligand) molecule. Compared to conventional molecules, they also have greater druggability and favorable pharmacokinetic characteristics. Additionally, MD simulations for 100 ns showed that the interactions between ligands and M^{pro} residues are a crucial component of the residues required for structural stability and functioning. The current in-silico experiments examines compounds' potential (17 and 39) as promising and effective therapeutic medication candidates against SARS-CoV-2.

Supplementary Information The online version contains supplementary material available at https://doi.org/10.1007/s12033-023-00667-5.

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Data Availability Data can be available upon request.

Declarations

Conflict of interest The authors have no conflict of interest.

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