RSC Advances



PAPER

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Cite this: RSC Adv., 2024, 14, 13237

Quinazolines and thiazolidine-2,4-dions as SARS-CoV-2 inhibitors: repurposing, in silico molecular docking and dynamics simulation

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This paper presents an extensive analysis of COVID-19 with a specific focus on VEGFR-2 inhibitors as potential treatments. The investigation includes an overview of computational methodologies employed in drug repurposing and highlights *in silico* research aimed at developing treatments for SARS-CoV-2. The study explores the possible effects of twenty-eight established VEGFR-2 inhibitors, which include amide and urea linkers, against SARS-CoV-2. Among these, nine inhibitors exhibit highly promising *in silico* outcomes (designated as 3–6, 11, 24, 26, 27, and sorafenib) and are subjected to extensive molecular dynamics (MD) simulations to evaluate the binding modes and affinities of these inhibitors to the SARS-CoV-2 M^{pro} across a 100 ns timeframe. Additionally, MD simulations are conducted to ascertain the binding free energy of the most compelling ligand–pocket complexes identified through docking studies. The findings provide valuable understanding regarding the dynamic and thermodynamic properties of the interactions between ligands and pockets, reinforcing the outcomes of the docking studies and presenting promising prospects for the creation of therapeutic treatments targeting COVID-19.

Received 16th March 2024 Accepted 18th April 2024

DOI: 10.1039/d4ra02029d

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1. Introduction

The global impact of the COVID-19 pandemic and the escalating number of deaths underscore the pressing requirement for scientists to discover new and potent medications. Despite the considerable challenges and time constraints associated with drug discovery, certain candidates have exhibited effectiveness against severe acute respiratory syndrome coronaviruses (SARS-CoV), offering promising prospects in the quest for viable treatments. There exist four distinct types of coronaviruses identified as α , β , γ , and δ . Notably, SARS-CoV, MERS-CoV, and SARS-CoV-2 fall within the category of β -coronaviruses. A comparative examination comparing the genetic sequences of these three viruses has unveiled a higher degree of similarity between SARS-CoV-2 and SARS-CoV, with an 89.1% match in their nucleotide sequences, compared to MERS-CoV. SARS-CoV-2 possesses a single-stranded, positive-sense RNA

genome, approximately 30 000 nucleotides long, and contains

a minimum of six open reading frames (ORFs). The genome is

As of now, there is no targeted antiviral treatment for COVID-19, with the primary strategy being supportive care. ¹² To expedite the search for effective treatments, researchers have adopted the strategy of drug repurposing, which involves exploring existing drugs for new therapeutic purposes in a short timeframe. ¹³ Molecular docking-based assays have emerged as essential tools for discovering potential antiviral agents, allowing researchers to screen and evaluate drug candidates prior to their synthesis. ¹⁴ This strategy, known as *in silico* virtual

enveloped by nucleocapsid proteins, forming ribonucleoprotein complexes. These ORFs are essential for synthesizing a minimum of 16 non-structural proteins and 4 structural proteins. Distinctively, SARS-CoV-2 features unique polybasic cleavage sites within its RNA genome, a trait that enhances the virus's pathogenicity and transmissibility among other betacoronaviruses.4 Specifically, the 229E gene within the SARS-CoV-2 genome is responsible for encoding two polyproteins, vital for producing functional polypeptides necessary for viral transcription and replication. A crucial component in this process is the 3 chymotrypsin-like proteases (3CLpro or M^{pro}), which is responsible for the cleavage of polyproteins at a minimum of 11 sites within the central and C-terminal regions, facilitating the release of essential proteins necessary for the virus's replication process.^{5,6} Given its central role, the viral protease (M^{pro}) has become a promising target for developing inhibitors against coronaviruses.7-11

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screening, utilizes computational methods to screen and simulate the interactions of potential drug candidates with the target protein, aiming to identify promising inhibitors for SARS-CoV-2 M^{pro}.

Repurposing existing drugs, which seeks to discover new therapeutic applications beyond their original medical indications, represents an efficient method in treatment development, including for cancer. 15,16 By exploring the potential of drugs that are already approved and in clinical use, this strategy provides a rapid and cost-effective route to identify effective treatments for various conditions. In the context of the COVID-19 outbreak, drug repurposing has been proposed for specific drugs.17-22 The strategy of repurposing existing drugs for COVID-19 treatment takes advantage of the extensive clinical history of commercially available medications, which come with welldocumented dosages and toxicity profiles. This familiarity potentially paves the way for these drugs to undergo fast-tracked and cost-efficient phase II-III clinical trials, or to be considered for compassionate use. It's worth noting that a notable number of the drugs being reconsidered for combating COVID-19 were originally developed as anticancer treatments. This resemblance is understandable and quite expected, given that both virus-infected cells and cancer cells exhibit similar characteristics, such as enhanced synthesis of nucleic acids, proteins, lipids, and increased energy metabolism to support their respective programs. Therefore, drugs targeting particular pathways in cancer cells might also impede viral replication. Identifying appropriate drugs for repurposing in treating COVID-19 requires a thorough examination of existing data from diverse sources, such as clinical studies, anecdotal evidence, and documented publications. This study provides a comprehensive analysis of VEGFR-2 inhibitors, initially developed for cancer therapy, exploring their potential repurposing for COVID-19 therapy.

1.1. Rational of the work

Nelfinavir, a potent inhibitor of HIV-1 protease, effectively blocks the replication of SARS-CoV.^{23,24} It also prevents the cytopathic impact of SARS-CoV virus. Ritonavir and lopinavir, which protease inhibitors employed in the treatment of SARS and MERS, work in similar ways as treatments designed for HIV.²⁵ HIV-1 protease inhibitors, such as fosamprenavir, nelfinavir, saquinavir, atazanavir, darunavir, lopinavir, ritonavir, and indinavir, contain urea and amide linkers as depicted in Fig. 1.²⁶

Our research is based on the pharmacophoric features of these urea and amide linkers found in VEGFR-2 inhibitors (Fig. 2).

Additionally, the inhibition activity of SARS-CoV-2 M^{pro} with N3 is modeled and various N3-analogues are explored for their potential as inhibitors with modifications to the recognition and warhead motifs (Fig. 2 and 3). The use of QM/MM modeling to inhibit M^{pro} suggests that these compounds might function as irreversible inhibitors or possess the potential to act as reversible inhibitors against M^{pro} inhibition.²⁷

The known M^{pro} predominantly employ a covalent mechanism, featuring a peptidomimetic scaffold at P1 position,

typically with a glutamine or an isostere, and a branched lipophilic group at **P2**, enhancing interaction with the M^{pro} enzyme.^{28–30} These inhibitors also incorporate a reactive warhead, as depicted in (Fig. 2 and 3).

In the quest to develop SARS-CoV-2 inhibitors, a diverse array of warheads has been employed, from traditional Michael acceptors (MAs) to activated carbonyl derivatives. MAs are notably favored for targeting cysteine proteases due to their ability to form covalent bonds with the enzyme, ensuring its inhibition. On the other hand, compounds with less reactive warheads, such as those based on carbonyl or nitriles, are known to act as reversible inhibitors. They achieve this by generating metastable adducts, like hemithioketal or thio-imidate species, with cysteine residues. The use of MAs is particularly advantageous in achieving sustained inhibition, enhanced target engagement, and greater efficacy compared to other warhead types.³¹

Our research expects derivatives to act as covalent inhibitors of SARS-CoV-2, akin to **N3**, including thiazolidine 2,4-dione derivatives and **sunitinib**, both designed to serve as classical MAs.

The initial strategy for creating new SARSCoV M^{pro} inhibitors was to examine their interaction with the N3 ligand, as initially suggested by Yang et al.32 Fig. 4 provides a schematic diagram showing the equilibrated structure of the binding site, highlighting key interactions identified in the molecular dynamics simulations and the X-ray structure reported by Jin et al.,30 represented by dashed lines in blue and red, respectively. In our equilibrated structure, the interaction between the enzyme and the inhibitor closely resembles what was observed through crystallography. This validates our initial structure and allows us to investigate the entire mechanism with confidence. Results from molecular dynamics simulations verify that specific side chains of the N3 residues (P2-P5) do not engage in hydrogen bond interactions. Given the efficacy of this inhibitor, this observation can serve as a reference for designing improved compounds that do not necessitate hydrogen bond interactions at these locations, as noted by Arafet et al.27

In contrast, VEGFR-2 inhibitors, ^{33,34} including **sorafenib** (with urea linkers) and **sunitinib** (with amide linkers), as well as our previously reported quinazoline and thiazolidine 2,4-dione derivatives, ^{35,36} display structural resemblances to HIV-1 protease inhibitors. Additionally, they exhibit key pharmacophoric features akin to the co-crystallized inhibitor ligand of SARS-CoV-2 M^{pro} (N3), as illustrated in Fig. 5. Thus, this research focuses on determining the potential efficacy of various VEGFR-2 inhibitors in combating SARS-CoV-2 through *in silico* molecular docking and MD simulation methods. Moreover, the VEGFR-2 inhibitors under scrutiny may serve as potential lead compounds for further optimization through structure–activity relationship studies aimed at boosting their effectiveness toward SARS-CoV-2 M^{pro}.

2. Materials and methods

In the molecular docking studies, AutoDock Tools software³⁷ and molesoft program³⁵ were used. The protein was handled

Fig. 1 The pharmacophoric amide and urea components of certain HIV-1 protease inhibitors.

with the Amber 18 molecular dynamics package³⁸ using the AMBERff14SB force field, 39 while the ligands were assigned the GAFF2 force field.⁴⁰ The reference standard in this research was the crystallized inhibitor ligand (N3).

2.1. Design of the evaluated VEGFR-2 inhibitors

Examining of the established compounds and checking the formal charges on atoms through 2D depiction. Energy minimization was applied, and partial charges were automatically calculated. The process involved applying energy minimization and the partial charges were determined. The validated compounds, including N3, were added into same database and stored as an MDB file to carry out docking analyses with the targeted protease.41

2.2. Preparation of the targeted SARS-CoV-2 M^{pro}

The structural data for SARS-CoV-2 M^{pro} was sourced from the Protein Data Bank, identified by the PDB identifier 6LU7 and a resolution of 2.16 Å.30 The crystal structure underwent protonation, and hydrogen atoms were introduced with their conventional three-dimensional geometry. Automatic adjustments were made to correct any errors in atom connections and

types, and potential rectifications were applied to the receptor and its atomic structure. The Site Finder tool was employed to identify the identical active site as the co-crystallized inhibitor, and dummy atoms were generated to represent the pocket within that site.42

2.3. Molecular docking of the evaluated VEGFR-2 inhibitors at active site of Mpro

The database, containing thirty VEGFR-2 inhibitors under investigation (labeled 1-30) alongside the co-crystallized inhibitor N3 (labeled 31), underwent docking analysis. The active site file was loaded, and the overall docking process was started. Adjustments were made to the program's configurations to align with the docking area (using dummy atoms), placement approach (triangle matcher), and evaluation criteria (London dG). A rigid receptor was utilized for refining the poses, and GBVI/WSA dG was used to score and select the top ten poses from a total of one hundred poses for each evaluated compound.43 The database file, containing thirty ligands, was imported, and the system then automatically executed the general docking operations. After completion, resulting poses

Fig. 2 The key pharmacophoric attributes of N3 (M^{pro} inhibitor) along with noted VEGFR-2 inhibitors incorporating urea and/or amide components.

were analyzed to identify those with optimal ligand-enzyme interactions and satisfactory root mean square deviation (RMSD) values for selection. To validate the target receptor, a docking process was initially performed using only the co-crystallized ligand, and low RMSD values between the docked and crystal conformations indicated a valid performance.^{44,45}

2.4. Molecular dynamics (MD) simulation

The top eight ranked score complexes (higher binding energies and lower RMSD), along with the **sorafenib** complex, underwent MD simulation for assessing their affinity for the protease enzyme. Linux 18.04 OS is used for MD simulation and also

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Fig. 3 A diagram illustrating the primary categories of covalent inhibitors targeting CoVs M^{pro} reported to date. The "R" emerging from the P2 residue symbolizes a moderately sized lipophilic group. The tail segment is a significantly variable area concerning both size and configuration and encompasses additional M^{pro} sub-pockets (i.e. S3 and S4) not depicted in the diagram.²⁷

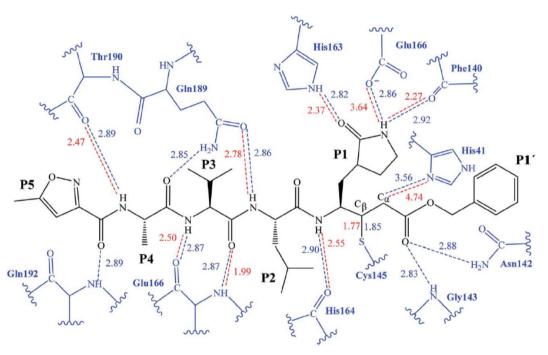


Fig. 4 Diagram representing N3 within binding site of SARS-CoV-2 M^{pro}. Dashed lines indicate hydrogen bonds between the inhibitor and the protein, identified in molecular dynamics simulations (shown in blue) and the X-ray structure (shown in red).30 Average interatomic distances, measured in Ångströms, from both molecular dynamics simulations and X-ray structural data are presented.

Amber MD 2018. Additionally, co-crystal ligand (N3) was included as a positive control in the docking and simulation. Force fields for the ligands were derived from GAFF2, 40 while the protein utilized the AMBERff14SB force field.39 The complex setup involved extending 15.0 Å in all directions, encapsulating it within an octahedral truncated box filled with TIP3P water, and neutralizing it to achieve a salt concentration equivalent to 150 mM NaCl. The setup underwent several stages of energy minimization and equilibration, progressively reducing positional restraints on both the ligand and protein, until achieving a stable state at a temperature of 310 K and a pressure of 1.0 bar. Subsequently, a 100 ns production run without restraints was conducted, saving the coordinates at 2 ns intervals. The ligand/ receptor binding energy has been calculated using the MM/ GBSA method, analyzing the trajectory with the MM/PBSA.py

script from Amber.46 Calculations were carried out on the final 50 ns segment; utilizing snapshots captured every 1 ns along the simulation trajectory.

3. Results and discussion

3.1. VEGF/VEGFR role during COVID-19 progression

VEGF belongs to the family of platelet-derived growth factor supergene and plays an important role in regulation of both pathological and physiological lymphangiogenesis, angiogenesis, and vasculogenesis under different conditions. 47 Following SARS-CoV-2 suppression of angiotensin-converting enzyme 2 (ACE2), the VEGF/VEGFR system is also interrupted, and consequently, the modulatory effect on the VEGF activation is hindered.48 It has been documented that some of the VEGF

Fig. 5 The molecular configurations of specific VEGFR-2 inhibitors endorsed by the FDA or under investigation, alongside the co-crystal inhibitor of SARS-CoV-2 M^{pro} (ligand N3).

subsets, as primary factors for thrombosis and coagulopathy progression, are up-regulated in COVID-19 positive patients, 48 which is supposed to be another reason for the reasonable correlation between VEGF elevated levels and COVID-19 induced ARDS (acute respiratory distress syndrome). In addition, different studies have shown that SARS-CoV-2 leads to accumulating the angiocentric mixed inflammatory cells in post-infection respiratory failure. 49

VEGF may play a substantial role in the pathogenesis of COVID-19 for multiple reasons: (1) the pulmonary edema, (2) decline oxygen saturation (sO_2), and (3) vascular remodeling, in part, due to disturbance of the alveolar-capillary membrane integrity, leading to fibrin deposition and development of the

ARDS-related fibro-proliferative phase. Moreover, VEGF can facilitate the virus transmission from the lung to the blood circulation *via* the impairment of glycocalyx, as a pericellular matrix in the lung tissue.⁴⁸ Notably, VEGF also has the potential to initiate neuroinflammation in the brain of COVID-19 nonsurvivors following the induction of inflammatory responses, as well as the disrupting effect on the blood–brain barrier.⁵⁰ It can be proposed that inhibition of VEGF could lead to vascular normalization and reduce the virus spreading throughout the body fluids. Among various VEGF members, VEGF-A is defined as a key vasodilator and permeability factor involved in angiogenesis, exhibiting a pro/anti-angiogenic property by VEGFR 1/2 activation.⁵¹ In detail, VEGFR-1 (sFIt-1) activation appears to be

as an endogenous VEGF inhibitor, while VEGFR-2 (KDR/Flk-1) presents an intense tyrosine kinase activity towards proangiogenic signals.51 VEGF-C and -D mainly stimulate VEGFR-3 to participate in lymphangiogenesis (Flt-4).51 It has also been well-established that VEGFA-stimulated VEGFR1/2 is considered as one of the critical processes for modulating multiple biological functions, such as ECs (Endothelial cells) proliferation, migration, and vascular permeability.⁵² To note, VEGFA/VEGFR2 system can also recruit the TSAd (T-cell-specific adapter) protein complex to simultaneously regulate VEGFA induced proto-oncogene tyrosine-protein kinase Src (sarcoma) activation, as well as vascular permeability in ECs. In the setting of COVID-19, VEGFA is also over-expressed in the lung tissue of the non-survivor individuals.51 Beyond the ACE2, other proteins like the neuropilin-1 receptor (NRP-1), as a co-receptor, also participate in SARS-CoV-2's spike protein cell entry. Remarkably, it has been shown that manipulating the VEGF-A165a subtype/b1 domain of NRP-1 signaling, which is up-regulated in the transcriptional levels during COVID-19, can affect disease transmission in asymptomatic subjects. 53 Bevacizumab, a humanized anti-VEGF monoclonal antibody, is being used to treat various types of cancer, including metastatic colorectal and renal carcinoma, lung, pancreatic, and breast cancers. Mechanistically, bevacizumab inhibits VEGF-mediated angio-

genesis by exclusively targeting VEGF in blood circulation to

impede the cancer cells' growth and subsequently confines the blood supply to tumor tissue. In this regard, the therapeutic potential of bevacizumab in COVID-19-induced pneumonia and ARDS is currently under intense investigation. Other classes with secondary anti-VEGF properties refer to sunitinib and sorafenib. These tyrosine kinase inhibitors (TKIs) blockade both cytosolic VEGF and platelet-derived growth factor (PDGF) receptor. However, there are limited data regarding their presumable therapeutic impact against either COVID-19 or non-COVID-19-induced ARDS. Rivoceranib, an oral antiangiogenesis inhibitor, competitively and selectively can inhibit the VEGFR-2, as well. Cyclosporine, an immunosuppressant agent with a possible anti-VEGF effect, also serves a vascular protective role accompanied by anti-angiogenic and antiapoptotic properties on ECs in low concentrations.⁵¹

On the other hand using VEGFA, a physiological ligand for the b1b2 pocket in neuropilin-1 receptor (NRP-1), it was interrogated that whether the Spike protein, the major surface antigen of SARS-CoV-2, could block VEGF-A/NRP-1 signaling to affect pain behaviors. Given parallels between the pronociceptive effects of VEGF-A in rodents and humans and clinical findings demonstrating increased VEGF-A levels in bronchial alveolar lavage fluid from COVID-19 patients coupled with substantially lower levels in the sera of asymptomatic individuals compared to symptomatic patients.54

Binding affinities and molecular interactions of selected VEGFR-2 inhibitors at the COVID-19 main protease N3 binding site

Ligands	Binding energy (kcal mol ⁻¹)	Amino acids involved	Distance (Å) 4.47, 3.98, 2.98	
Sorafenib	-8.0	CYS 145, CYS 145, ASN 142		
Sunitinib	−7. 5	CYS 145, GLY 143	3.40, 3.11	
1	−7.9	GLY 143	2.80	
2	−7. 5	CYS 145, HIP 164, GLU 166	3.78, 2.87, 4.89	
3	-9.2	SER 144, GLY 143, GLY 143	2.99, 2.96, 4.79	
4	-8.8	CYS 145, GLY 143	3.25, 4.75	
5	-8.5	ASN 142, GLY 143	3.08, 3.29	
6	-8.9	GLN 189, GLY 143, GLY 143, HIE 41	3.23, 3.24, 2.82, 3.88	
7	-8.1	GLU 166, GLU 166, THR 190, GLU 166	3.21, 3.95, 3.53, 4.67	
8	-8.0	GLN 189, GLY 143, GLU 166, THR 25	3.18, 2.96, 2.80, 4.08	
9	-7.8	CYS 145, HIP 164	3.67, 3.37	
10	−7.9	THR 190, GLU 166	3.39, 4.52	
11	-8.3	LEU 141, ASN 142, CYS 145, ASN 142	3.33, 3.59, 3.17, 4.74	
12	-6.4	HIE 41	3.85	
13	-6.7	GLN 189, GLY 143, SER 144, HIE 41	3.53, 2.99, 2.76, 3.87	
14	-6.1	CYS 145	3.18	
15	−7.3	GLN 189, GLY 143, HIE 41	3.48, 3.29, 3.92	
16	-7.8	HIE 163	3.11	
17	-7.1	GLY 143, HIE 41	3.17, 3.89	
18	−7. 5	THR 24, GLN 189, GLY 143, THR 25, HIE 41	3.11, 3.53, 3.19, 4.09, 3.90	
19	−7.7	GLU 166, HIE 41	3.10, 3.87	
20	−7.3	THR 24, GLN 189, GLY 143, HIE 41	3.17, 3.52, 3.22, 3.90	
21	-7.1			
22	−7.7	HIE 163	3.22	
23	-7.4	ASN 142, CYS 145, GLN 189	3.56, 3.11, 3.13	
24	-8.1	CYS 145, CYS 145, THR 26, MET 165	3.46, 3.73, 3.13, 3.88	
25	-7.4	CYS 145, CYS 145, ASN 142, THR 26, MET 165	3.44, 3.78, 3.35, 3.19, 3.89	
26	-8.2	GLY 143, GLU 166, HIE 41, THR 26	2.97, 2.95, 4.89, 4.56	
27	-9.0	GLN 189, GLY 143, GLU 166, THR 26, GLN 189	3.07, 2.84, 2.89, 4.51, 4.28	
28	-7.3	SER 144	3.05	
N3	-8.1	MET 165, GLY 143	3.40, 2.96	

Moreover, World Health Organization (WHO) has labeled several variants, including alpha (B.1.1.7), beta (B.1.351), gamma (P.1), delta (B.1.617.2), and the newly identified omicron (B.1.1.529), as variants of concern because of the potential risks associated with them. 55 These variants continue to evolve, leading to different mutations in the M^{pro} protein that can cause changes in its structure, enzymatic activity, and impact the effectiveness of therapeutic strategies targeting M^{pro}.56 Recent research has demonstrated that the P108S mutation in SARS-CoV-2 M^{pro} disrupts the structure around the substratebinding site, resulting in reduced enzyme activity and less severe disease outcomes in patients infected with the B.1.1.284 sublineage.⁵⁷ On the other hand, the Omicron variant, known for its high transmissibility, contains a single-point mutation, P132H, in M^{pro}. However, ongoing mutations in SARS-CoV-2 could lead to changes in M^{pro} structures, potentially causing resistance to M^{pro} inhibitors. While the wild-type variant is of lesser interest, we will extend our investigation to include emerging variants. This will ensure the continued applicability of our findings in the dynamic landscape of COVID-19.

Our results augmented the abovementioned data as VEGFR-2 inhibitors can be used in treatment of COVID-19 but more detailed future studies should be carried out to investigate the different mechanisms by which VEGFR-2 inhibitors can inhibit different SARS-CoV-2 variants progression.

3.2. Molecular docking examinations

The M^{pro} enzyme of the COVID-19 virus possesses a catalytic dyad consisting of Cys and His residues, located within a cleft that

bridges domains I and II, serving as the substrate-binding region. The N3 inhibitor is precisely accommodated in the substrate-binding pocket of the COVID-19 virus M^{pro}, characterized by an asymmetric unit that comprises a single polypeptide. Molecular docking simulations were carried out for VEGFR-2 inhibitors (labeled 1–35) and the N3 inhibitor (labeled 36), targeting the active site of the M^{pro} enzyme. The results of the docking simulations were benchmarked against the crystal structure of protein and its ligand-binding site showcasing high levels of accuracy and success, as detailed in Table 1. The N3 ligand has been successfully positioned within the active site of M^{pro}, identified by PDB code 6LU7, achieving an RMSD value of 0.98 Å for the docked ligand. This demonstrates a precise overlay with the original bound ligand, as illustrated in Fig. 6. The findings underscore the high precision of the docking simulation.

The suggested binding pattern of N3 closely aligns with the findings reported by Jin *et al.* and demonstrates the formation of eight hydrogen bonds. Specifically, N3 forms two hydrogen bonds with GLU166 (at distances of 1.80 Å and 1.94 Å), one with SER144 (at 1.70 Å), one with GLY143 (at 2.22 Å), one with PHE140 (at 2.43 Å), one with HIE164 (at 2.76 Å), one with GLN189 (at 2.33 Å), and one with THR190 (at 2.22 Å). Additionally, it engages in numerous hydrophobic interactions, occupying various hydrophobic grooves, as depicted in Fig. 7.

The majority of compounds exhibited binding patterns similar to that of the **N3** inhibitor, with several poses demonstrating improved active modes and strong bonds within the receptor site (Fig. 8).

Selected poses were those with the highest scores, reflecting pose stability, and rmsd_refine values, which suggest closeness

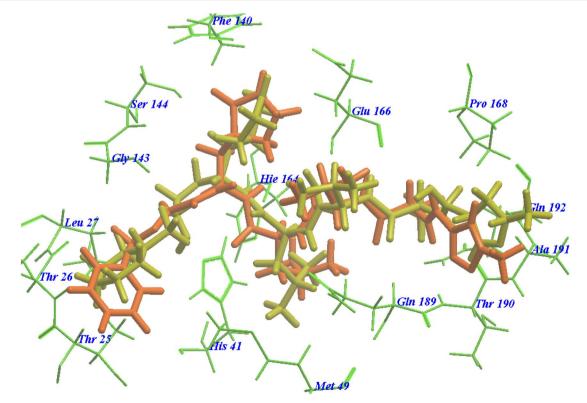


Fig. 6 Superimposition of co-crystal ligand (N3) onto the binding pocket of 6LU7 protein structure.

Paper RSC Advances

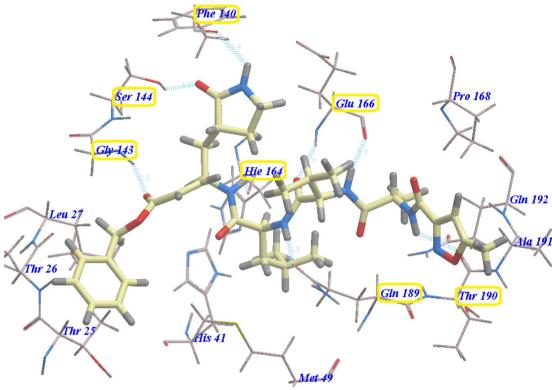


Fig. 7 N3 docked within the active site of 6LU7 protein structure.

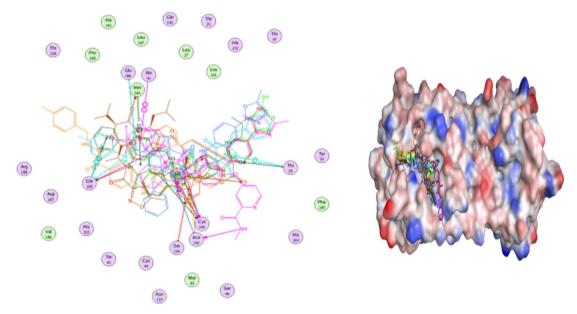


Fig. 8 Overlay of certain docked compounds within the active site of 6LU7.

of the selected pose to the ligand position within the pocket. A variety of electrostatic bonds stabilized the docked compounds within the N3-active site of $M^{\rm pro}$ (Fig. 9). Energy results and diverse interactions with amino acids within the $M^{\rm pro}$ protein pocket are detailed in Table 1.

Lastly, certain VEGFR-2 inhibitors showcased binding scores ranging from -8.0 to -9.2, demonstrating equal or superior

potency compared to the co-crystallized ligand N3, which has a score of -8.1.

3.3. Molecular dynamics (MD) simulation

MD simulation studies were employed to explore the relative stability and dynamic behavior of ligand-target complexes, providing insights into their conformational changes over time.

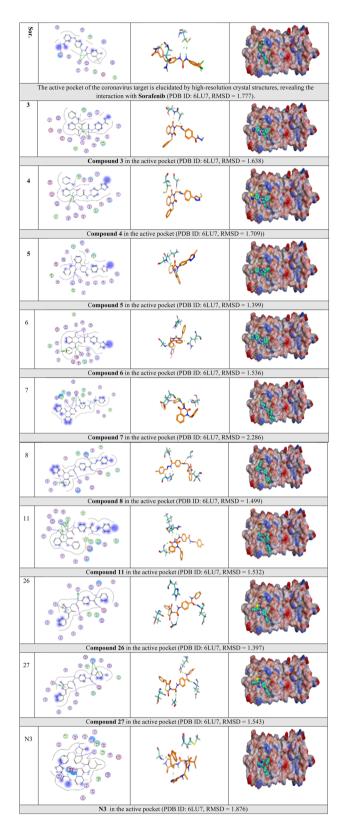


Fig. 9 2D, 3D, and surface representations, as well as maps, depicting N3 and VEGFR-2 inhibitors within the M^{pro} protein, 6LU7.

Unlike other *in silico* methods such as molecular docking and mechanics energy minimization, MD simulations allow for a more comprehensive examination of the conformational space of ligand–target interactions, going beyond static image analysis. 58

The top docked configurations, demonstrating substantial interactions and affinity between the ligand and M^{pro}, were subjected to an all-atom MD simulation for duration of 100 nanoseconds. This facilitated a detailed investigation of the conformational alterations in the ligand-target complexes of VEGFR-2 inhibitors (3–6, 11, 24, 26, 27, and sorafenib) and N3 within the canonical binding site of SARS-CoV-2 M^{pro}., shedding light on their dynamic behavior throughout the interaction process.

3.3.1. Analysis of global stability for ligand-protein binding. The VEGFR-2 inhibitors under investigation demonstrated notable stability within the active site of the target, which was determined by the monitoring RMSD values across the 100 ns all-atom MD simulations. RMSD serves as a measure of molecular deviation from a designated reference structure, providing insight into ligand–target stability.

High RMSD trajectories in molecular dynamics simulations often signal instability within the target protein and substantial conformational shifts. Conversely, elevated complex RMSD values point to a weak affinity between the ligand and its target, highlighting the ligand's struggle to consistently occupy the established binding site. 59 In the case of Mpro proteins, the observed RMSD deviations, especially concerning their C-alpha atoms (C-α RMSD), aligned with expected outcomes in MD simulations (Fig. 10). At the onset of the MD simulations, a rise in the RMSD values for the protein's Ca atoms was observed, a phenomenon attributed to the removal of initial restraints. Following this initial phase, the RMSD trajectories for the C- α atoms demonstrated a stable pattern for a significant portion of the simulation duration, specifically more than 50 nanoseconds. Notably, the protein complex involving BIS exhibited a phase of reduced RMSD variability, particularly between 55 and 85 nanoseconds, indicating a period of enhanced stability.

3.3.2. Assessment of binding free energy. The calculation of free energy was conducted to offer in-depth understanding of the ligand-protein docking mechanism and to provide detailed insights into the contribution of individual ligands to the overall binding affinity.60 The binding free energy was determined using the MM/GBSA method, indicating that a more substantial negative value corresponds to enhanced affinity between the ligand and its target site. 61 The MM/GBSA approach employs implicit solvent models to facilitate swift and efficient energy estimations while maintaining a high degree of accuracy. This technique has been validated through its successful prediction of ligand positions in a diverse array of proteinligand complexes, featuring unique binding configurations.⁶² The calculation was conducted over the 100 ns MD simulation timeframe, justified by the rapid stabilization and convergence observed in the RMSD trajectories of the complexes after the initial MD frames. Notably, compounds 3 and 27, which are inhibitors of VEGFR-2 and target the SARS-CoV-2 Mpro, demonstrated pronounced affinity for the enzyme's active site. This was substantiated by the calculated free binding energy and affinity metrics presented in Table 2 and Fig. 11.

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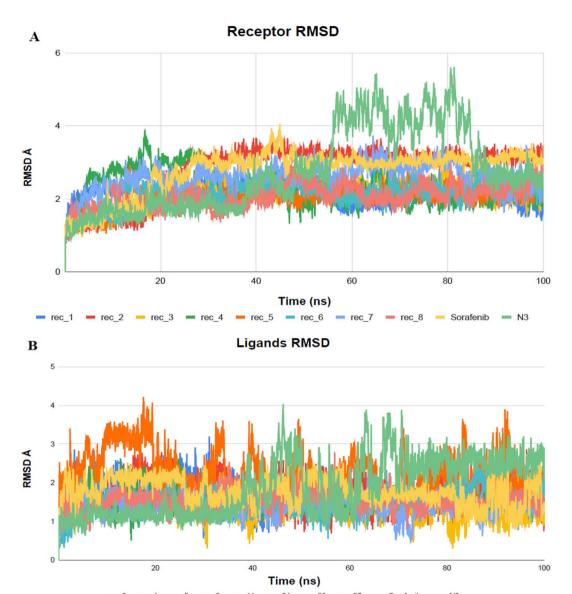


Fig. 10 Examination of RMSD trajectories for the complexes formed by the ligand and M^{pro} protein over MD simulation (100 ns). (A) Represents the backbone RMSD; (B) displays the ligand RMSD vs. time plots for molecular dynamics simulations (nanoseconds)

Table 2 The mean of overall binding free energies (expressed in kcal mol⁻¹) and the specific energy terms associated with potential VEGFR-2 inhibitor compounds and the reference N3 at M^{pro} protein active sites

Ligands	EEL	VDWAALS	$\Delta G_{ m gas}$	$\Delta G_{\rm solv}$	ΔTotal
2	21.0265	45 7400	67.6275	24.1650	22 4717
3	-21.9265	-45.7109	-67.6375	34.1658	-33.4717
4	-5.1472	-9.4382	-14.5854	8.4373	-6.1481
5	-13.0207	-24.5178	-37.5385	21.2820	-16.2566
6	-17.5238	-36.9243	-54.4481	29.5398	-24.9083
11	-12.3774	-38.7219	-51.1008	24.5090	-26.5918
24	-12.3596	-32.1424	-44.5020	23.2094	-21.2926
26	-12.9159	-33.8802	-46.7961	23.6342	-23.1619
27	-21.8916	-43.5004	-65.3920	36.9703	-28.4216
Sorafenib	-39.2863	-32.4855	-71.7718	50.7580	-21.0138
N3	-28.2044	-47.8873	-76.0916	43.6267	-32.4650

Analyzing the binding-free energy components, van der Waals interactions emerged as the primary contributor to the ligandprotein complex's free-binding energy, surpassing electrostatic potential energy with the exception of sorafenib. The solute's energy in the gas phase ($\Delta G_{\rm gas}$) encompasses internal energies, along with energies arising from van der Waals interactions and electrostatic forces. Solvation free energy, ΔG_{solv} , consists of polar and non-polar components, $\Delta G_{\text{solv}} = \Delta G_{\text{pol}} + \Delta G_{\text{nonpol}}$. Notably, the N3 inhibitor showed elevated levels of gas-phase energy $(\Delta G_{\rm gas})$ and solvation energy $(\Delta G_{\rm solv})$ in comparison to the evaluated VEGFR-2 inhibitors, apart from sorafenib, which demonstrated the highest solvation energy. Contemporary studies suggest that the binding site of M^{pro} is predominantly hydrophobic, attributed to its depth, minimal exposure to solvent, and the presence of conserved residues that line the hydrophobic pocket. Given its hydrophobic characteristics and significant

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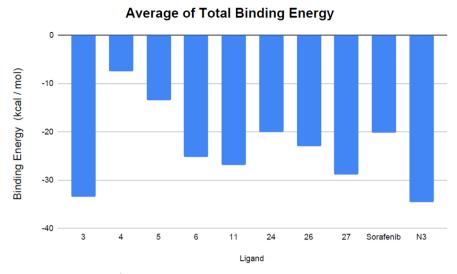


Fig. 11 Mean total binding energy (in kcal mol^{-1}) of the evaluated VEGFR-2 inhibitors and the co-crystallized ligand N3.

surface area, the M^{pro} active site may favor robust nonpolar interactions, particularly with N3, due to its extended configuration within the binding site. Furthermore, compounds 3 and 27 exhibited consistent binding behaviors during both the docking studies and the MD simulations. Specifically, compound 3 displayed a more advantageous free-binding energy at the M^{pro} binding site than the N3 inhibitor, underscoring its heightened affinity for the target as initially indicated by the docking analysis. The remarkable binding energy value observed for the most stable VEGFR-2 inhibitor, compound 3, aligns closely with its leading position in the initial docking score rankings (Table 1).

Conclusion

The findings of the study highlight the potential of twenty-eight known VEGFR-2 inhibitors that have amide and urea moieties as possible agents against SARS-CoV-2. Through in silico analysis, nine specific compounds (3-6, 11, 24, 26, 27, and sorafenib) demonstrated promising results and were subjected to extensive MD simulations to assess their inhibitory effects on SARS-CoV-2 M^{pro} over a duration of 100 ns. By utilizing MM/ GBSA calculations to determine binding-free energies, compounds 3 and 27 exhibited significant affinity and energy as VEGFR-2 inhibitors binding to the targeted pocket of SARS-CoV-2 M^{pro}. These findings substantiate the suggested approach and align with the computational results obtained through molecular docking and dynamics, indicating the potential effectiveness of other studied VEGFR-2 inhibitors. Therefore, we recommend further preclinical and clinical investigations to repurpose FDA-approved VEGFR-2 inhibitors as a strategic response to the Covid-19 crisis. Additionally, these drugs can serve as valuable starting points for structural modifications aimed at enhancing their efficacy against SARS-CoV-2.

Conflicts of interest

The authors declare no conflict of interest.

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