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# Targeting SARS-CoV-2 main protease: a successful story guided by an *in silico* drug repurposing approach

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**ABSTRACT:** The SARS-CoV-2 main protease (M<sup>pro</sup>) is an essential enzyme for viral replication and has been considered an attractive drug target for the treatment of COVID-19. In this study, virtual screening techniques and *in vitro* assays were combined to identify novel M<sup>pro</sup> inhibitors starting from around 8000 already approved-FDA drugs. The docking analysis highlighted 17 promising best *hits*, biologically characterized in terms of their M<sup>pro</sup> inhibitory activity. Among them, 7 cephalosporins and the oral anticoagulant betrixaban were able to block the enzyme activity in the micromolar range with not cytotoxic effect at the highest concentration tested. After the evaluation of the degree of

conservation of M<sup>pro</sup> residues involved in the binding with the studied ligands, the ligands' activity on SARS-CoV-2 replication was assessed. The ability of betrixaban to affect SARS-CoV-2 replication associated to its antithrombotic effect could pave the way for its possible use in the treatment of hospitalized COVID-19 patients.

## Introduction

In December 2019 a novel virus defined severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) spread rapidly around the world and caused the outbreak of coronavirus infectious disease 2019 (COVID-19). As of January 2023, the number of confirmed infections has reached nearly 630 million causing more than six million fatalities.<sup>1</sup> SARS-CoV-2 is a positive-strand RNA enveloped beta-coronavirus, and similar to severe acute respiratory syndrome coronavirus (SARS-CoV) and Middle East respiratory syndrome coronavirus (MERS-CoV), contains a genome encodes non-structural proteins including main protease (M<sup>pro</sup>, also known as 3-chymotrypsin-like protease, 3CL<sup>pro</sup>), papain-like protease (PL<sup>pro</sup>), helicase, and RNA-dependent RNA polymerase (RdRp).<sup>2, 3</sup> Among them, M<sup>pro</sup>, resulting from the maturation of at least 12 non-structural proteins,<sup>4</sup> is a crucial enzyme in the viral life cycle and could be selectively inhibited since its structure and substrate are different from human proteases.<sup>5, 6</sup> Structurally, SARS-CoV-2 M<sup>pro</sup> contains three structural domains connected by flexible loops. Domains I and II are  $\beta$ -barrel domains and include the catalytic active site region, whereas domain III is an  $\alpha$ -helical domain shown to be critical for dimerization.<sup>7</sup> The active site contains a catalytic dyad consisting of a cysteine residue (Cys145), that acts as a nucleophile, and a histidine residue (His41) that acts as the general acid or base, aiming at the cleavage of the polyprotein 1a (pp1a) and 1ab (pp1ab) translated from the viral RNA at 16 different positions to produce various nonstructural proteins engaged in stopping the viral assembly process in the replication cycle.<sup>8</sup> Even though all viral enzymes that participate in SARS-CoV-2 replication are possible druggable targets, main efforts were focused on M<sup>pro</sup> due to its essential role in viral replication and pathogenesis.<sup>9, 10</sup>

To achieve this goal, multiple drug discovery strategies, such as virtual screening, drug repurposing, high-throughput screening (HTS), and structure-based drug design, were employed to identify promising M<sup>pro</sup> inhibitors against SARS-CoV-2.<sup>5, 6, 11-14</sup> Thereby, numerous marketed drugs and other structurally diverse synthetic and natural compounds were found to be efficacious inhibitors of SARS-CoV-2 M<sup>pro</sup>. For example, multiple lead M<sup>pro</sup> inhibitors, such as boceprevir,<sup>10</sup> an HCV serine protease inhibitor,<sup>15</sup> SDZ-224015,<sup>16</sup> an investigational caspase-1 inhibitor,<sup>17</sup> and GC-376,<sup>10</sup> a cysteine protease covalent inhibitor against picornaviruses, noroviruses, and coronaviruses,<sup>18</sup> arised from efficient high-throughput (HTS) inhibition experiments. Similarly, some M<sup>pro</sup> inhibitors with a high *in vitro* and *in vivo* potency, such as PF-00835231 and PF-07304814,<sup>19</sup> N3<sup>20</sup> and the  $\alpha$ -ketoamide<sup>6</sup> have been highlighted by applying *de novo* development programs, now faster and more easily feasible thanks to the availability of detailed M<sup>pro</sup> structural information as well as of structure-activity relationship (SAR) studies with reported SARS-CoV and MERS-CoV M<sup>pro</sup> inhibitors.<sup>21-23</sup>

To date, the only compound in clinical use as M<sup>pro</sup> inhibitor is PF-07321332 (nirmatrelvir),<sup>24</sup> a reversible covalent inhibitor co-formulated with ritonavir allowing an oral route of administration (known as Paxlovid). It results in roughly a 90% protection against severe COVID-19 and hospitalization<sup>25</sup> and, even in presence of evolutionary mutations at the M<sup>pro</sup>-gene, its antiviral potency does not seem to be compromised.<sup>26</sup> Despite the above-mentioned success stories of *de novo* development, the significant time and costs required are detrimental due to the emergency the world has been dealing with in the last three years. Therefore, the drug repurposing of approved or investigational drugs still represents a practical approach for the fast identification, characterization and development of antiviral treatments thanks to the availability of existing detailed data on drug medicinal chemistry, human pharmacology and toxicology.<sup>27</sup> Several drugs with diverse mechanisms of action were clinically investigated to develop a potential treatment for COVID-19 and, among the repurposed drugs evaluated in clinical trials, the antivirals remdesivir (a monophosphoramidate prodrug of the nucleoside GS-

441524, originally developed to treat Ebola virus infections)<sup>28</sup> and molnupiravir (a prodrug of the nucleoside analogue  $\beta$ -D-N4-hydroxycytidine originally developed against different RNA viruses such as influenza)<sup>29</sup> are the only ones in clinical use as SARS-CoV-2 RNA-dependent RNA polymerase (RdRp) inhibitors. These broad-spectrum antiviral drugs have been shown to reduce the progression of COVID-19 and associated clinical symptoms along with a substantial decrease in recovery time.<sup>30, 31</sup>

Nevertheless, efficient treatments are still required, above all for people unvaccinated or immunocompromised patients that may not fully respond to vaccination, and for crossing the vaccine escape induced by the occurrence of viral mutations.<sup>32</sup>

Herein, we applied an *in silico* drug repurposing approach towards M<sup>pro</sup> enzyme by screening more than 8000 approved and investigational Food and Drug Administration (FDA) compounds and then we experimentally validated the most promising repurposed drugs. Given the crucial role of M<sup>pro</sup> in coronavirus replication, a sequence conservation analysis was carried out to characterize the degree of conservation of the enzyme and to get insights on the conservation of the residues involved in the binding with the identified compounds.

Among 17 selected molecules, 8 were found to effectively inhibit SARS-CoV-2 M<sup>pro</sup> activity and 3 of them in a low micromolar range. Particularly, the most potent compound, the oral anticoagulant betrixaban, was also able to block the viral replication in the micromolar range.

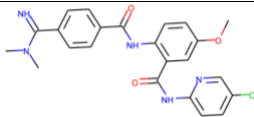
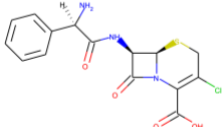
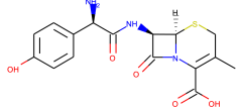
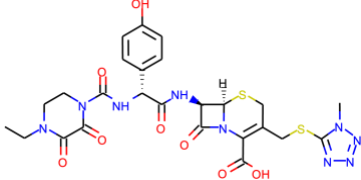
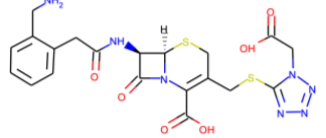
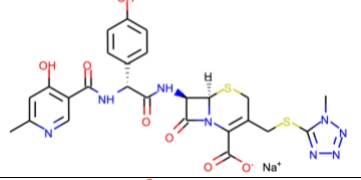
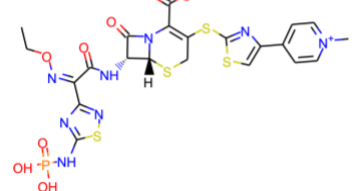
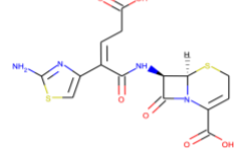
## RESULTS AND DISCUSSION

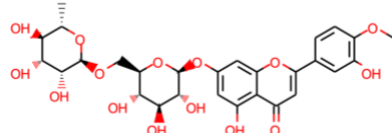
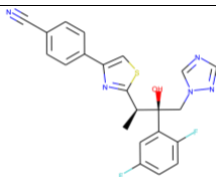
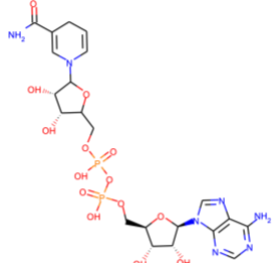
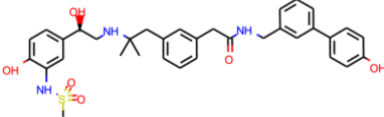
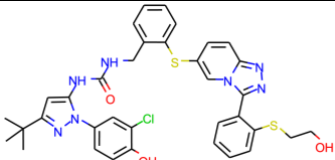
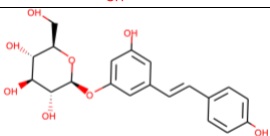
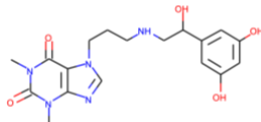
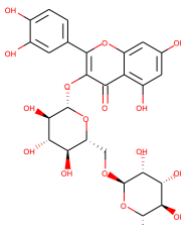
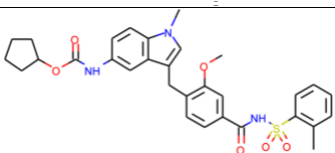
### In silico drug repurposing

Starting from the M<sup>pro</sup> crystal structure deposited in the Protein Data Bank (PDB) with the PDB code 6Y2G, we performed Molecular Dynamics simulations (MDs) in order to explore all the possible conformational changes into M<sup>pro</sup> binding site. The whole trajectory was then clustered with respect to the Root Mean Square Deviation (RMSD), thus obtaining four representative structures. By applying a drug repurposing approach, we carried out a structure-based virtual screening of the FDA already

approved and investigational drugs against the four generated clusters of SARS-CoV-2 M<sup>pro</sup> with the aim to identify promising inhibitors. According to their average Glide docking score (D-score) ranking, obtained as consensus value of the four used clusters, we finally selected the 17 best *hits* reported in Table 1 (for details, see the experimental section).

**Table 1.** DrugBank ID code, Name, 2D representation and Glide average docking scores (D-scores) of the best 17 compounds identified by the structure-based virtual screening approach.

| N° | DrugBank ID | Name                 | 2D structure                                                                         | Average D-score* |
|----|-------------|----------------------|--------------------------------------------------------------------------------------|------------------|
| 1  | DB12364     | Betrixaban           |    | -8.14            |
| 2  | DB00833     | Cefaclor             |    | -7.96            |
| 3  | DB01140     | Cefadroxil           |    | -7.52            |
| 4  | DB01329     | Cefoperazone         |   | -8.59            |
| 5  | DB00923     | Ceforanide           |  | -7.58            |
| 6  | DB00430     | Cefpiramide sodium   |  | -8.64            |
| 7  | DB06590     | Ceftaroline fosamil  |  | -7.64            |
| 8  | DB01415     | Ceftibuten dihydrate |  | -7.50            |

|    |         |               |                                                                                      |       |
|----|---------|---------------|--------------------------------------------------------------------------------------|-------|
| 9  | DB08995 | Diosmin       |    | -8.52 |
| 10 | DB11633 | Isavuconazole |    | -7.74 |
| 11 | DB00157 | NADH          |    | -8.45 |
| 12 | DB11871 | PF-00610355   |    | -8.41 |
| 13 | DB12138 | PF-03715455   |   | -8.87 |
| 14 | DB11263 | Polydatin     |  | -8.02 |
| 15 | DB12846 | Reproterol    |  | -8.78 |
| 16 | DB01698 | Rutin         |  | -8.58 |
| 17 | DB00549 | Zafirlukast   |  | -7.67 |

\*D-scores values are expressed in kcal/mol.

### Effect of candidate drugs on SARS-CoV-2 M<sup>pro</sup> activity in FRET assay

The 17 best candidates were purchased and then tested for their inhibitory properties against SARS-CoV-2 M<sup>pro</sup> in a biochemical assay. While a part of the compounds resulted inactive ( $IC_{50} > 30 \mu M$ , namely the highest tested concentration in our assay), we found that some of them were able to inhibit SARS-CoV-2 M<sup>pro</sup> with  $IC_{50}$  values in the micromolar range. In particular, two compounds, cefpiramide sodium and ceftibuten dehydrate, showed an  $IC_{50}$  value around  $30 \mu M$ , while ceforanide, ceftaroline fosamil and cefaclor inhibited SARS-CoV-2 M<sup>pro</sup> within a range of  $14.9 - 24 \mu M$  (Table 2). Moreover, cefadroxil and cefoperazone blocked the M<sup>pro</sup> protease activity with  $IC_{50}$  values in the low micromolar range ( $2.4 - 4.9 \mu M$ ). Noteworthy, betrixaban, was able to hamper *in vitro* the enzymatic activity of M<sup>pro</sup> with submicromolar  $IC_{50}$  values (Table 2).

**Table 2.** Inhibition of SARS-CoV-2 M<sup>pro</sup> activity by compounds.

| Compound             | SARS-CoV-2 M <sup>pro</sup><br><sup>a</sup> $IC_{50}$ ( $\mu M$ ) |
|----------------------|-------------------------------------------------------------------|
| Betrixaban           | $0.9 \pm 0.0053$                                                  |
| Cefaclor             | $24.0 \pm 5.65$                                                   |
| Cefadroxil           | $2.4 \pm 0.1$                                                     |
| Cefoperazone         | $4.9 \pm 0.6$                                                     |
| Ceforanide           | $14.9 \pm 4.1$                                                    |
| Cefpiramide sodium   | $30.0 \pm 0.1$                                                    |
| Ceftaroline fosamil  | $18.7 \pm 5.3$                                                    |
| Ceftibuten dihydrate | $30.0 \pm 0.1$                                                    |
| Diosmin              | $> 30$ (68%)                                                      |
| Isavuconazole        | $> 30$ (57%)                                                      |
| NADH                 | $> 30$ (55%)                                                      |
| PF-03715455          | $> 30$ (100%)                                                     |

|                    |                   |
|--------------------|-------------------|
| <b>PF-00610355</b> | > 30 (100%)       |
| <b>Polydatin</b>   | > 30 (66%)        |
| <b>Reproterol</b>  | > 30 (100%)       |
| <b>Rutin</b>       | > 30 (100%)       |
| <b>Zafirlukast</b> | > 30 (100%)       |
| <b>GC376</b>       | 0.00014 ± 0.00001 |

<sup>a</sup>Compound concentration required to reduce enzyme activity by 50%.

Analyzing the *in vitro* enzymatic assays' results it was noted that the most interesting compounds belong to the class of cephalosporin drugs and oral anticoagulants.

Cephalosporins are  $\beta$ -lactams widely used antibacterial drugs, but it was demonstrated that they could also inhibit other classes of nucleophilic enzymes, such as human cathepsins, viral cysteine proteases and mycobacterial L,D-transpeptidases.<sup>33-37</sup> Recently, Malla and co-workers obtained some penicillin derivatives as potent M<sup>pro</sup> inhibitors and, by using mass spectrometric and crystallographic analyses, they elucidated their mechanism which involve a reaction with the nucleophilic cysteine to form a stable acyl-enzyme.<sup>37</sup> All these data promote the study of  $\beta$ -lactams, in particular cephalosporin drugs, for other therapeutics indications, including the treatment of COVID-19 and other viral diseases.

Betrixaban competitively and directly inhibits the serine-protease factor Xa, thus preventing the conversion from prothrombin to thrombin, and in turn disrupting the coagulation cascade.<sup>38, 39</sup> Additionally, along other inhibitors of the Xa factor, such as apixaban and rivaroxaban, betrixaban has been studied for the potential antiviral activity against coronaviruses including SARS-CoV-2,<sup>40, 41</sup> thus enforcing our findings.

**Binding mode analysis of the active compounds complexed to M<sup>pro</sup>**

By analyzing the binding modes of the best candidates, betrixaban, cefaclor, cefadroxil, cefoperazone, ceforanide, cefpiramide sodium, ceftaroline fosamil and ceftibuten dihydrate complexed to the most representative receptor structure of SARS-CoV-2 M<sup>pro</sup>, we observed that all compounds were involved in productive interactions with the three substrate-binding subsites (S1, S2 and S4) of the enzyme.

Specifically, as reported in Figure 1A, betrixaban was involved in 3 crucial hydrogen bonds (HBs) with Gly143, Ser144 and the catalytic Cys145. The ligand was further stabilized through a  $\pi$ - $\pi$  stacking interaction with His41 and an HB and a salt-bridge with Glu166, which is essential for keeping the S1 pocket in the correct shape and the enzyme in the active conformation.<sup>6</sup> Concerning cefaclor binding mode, the oxygen of its  $\beta$ -lactam ring was bound to histidine at position 41, also involved in a  $\pi$ - $\pi$  stacking interaction with the phenyl ring of the drug (Figure 1B), while cefadroxil and cefoperazone, two broad-spectrum antibiotic agents used in the treatment of respiratory tract infections, peritonitis, skin infections, endometritis, and bacterial septicaemia,<sup>42</sup> were found to establish pivotal HBs with Cys145 and Glu166. Moreover, the phenol OH group of both cefadroxil and cefoperazone was involved in 2 HBs with Thr190 and Gln192. Cefoperazone was further stabilized by means of a  $\pi$ - $\pi$  stacking interaction between its tetrazole ring and histidine at position 41, while cefadroxil was found to engage an additional HB with Ser144 (Figure 1C and D). As reported in Figure 2E, ceforanide, a semisynthetic second-generation cephalosporin, was involved in HBs with Thr26, His41, Cys145, Glu166 and Gln192, while cefpiramide sodium, a third-generation cephalosporin antibiotic, active against *Pseudomonas aeruginosa* and characterized by a broad spectrum of antibacterial activity, was involved in several HBs with Cys145, Glu166 and Thr190. The compound was further stabilized by a  $\pi$ - $\pi$  stacking interaction between its tetrazole ring and His41 (Figure 1F). Ceftaroline fosamil, an advanced-generation parental cephalosporin used to treat Community-Acquired Bacterial Pneumonia,<sup>43</sup> made 4 HB interactions with Thr25, Ser46, Gly143 and Glu166 (Figure 1G), while the third-generation cephalosporin ceftibuten, commonly used in the treatment of acute bacterial exacerbations of chronic

bronchitis, acute bacterial otitis media, pharyngitis, and tonsillitis was engaged in an HB with Gly143 and a  $\pi$ - $\pi$  stacking interaction with His41 (Figure 1H). All the analyzed drugs were also involved in several hydrophobic contacts with Leu27, Val42, Met49, Met165, Leu167 and Pro168 residues, thus enhancing their binding to the active site of SARS-CoV-2 M<sup>pro</sup>.

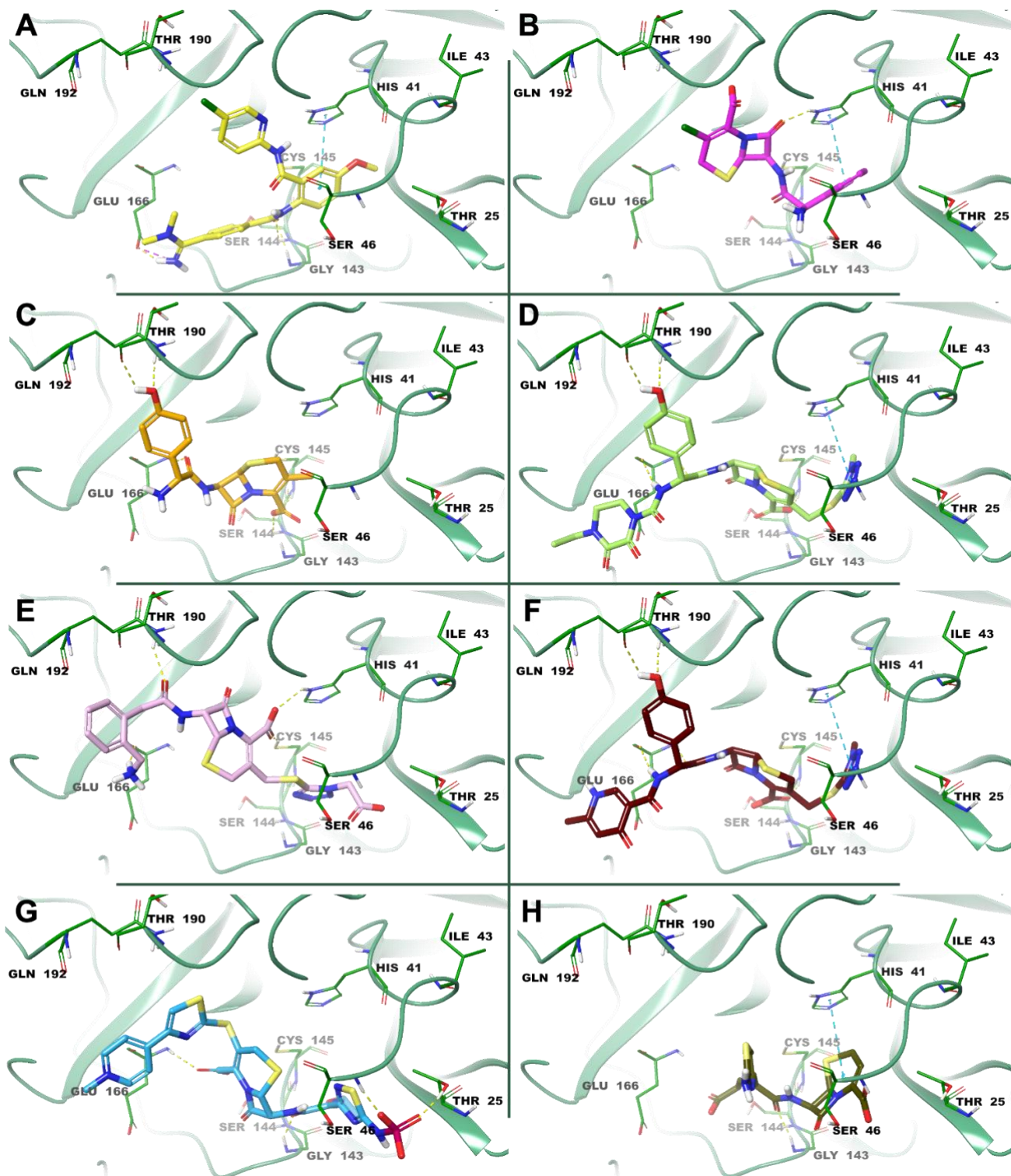
The 2D binding mode of the inactive compounds in complex with SARS-CoV-2 M<sup>pro</sup> was reported in

Supporting

Information,

Figure

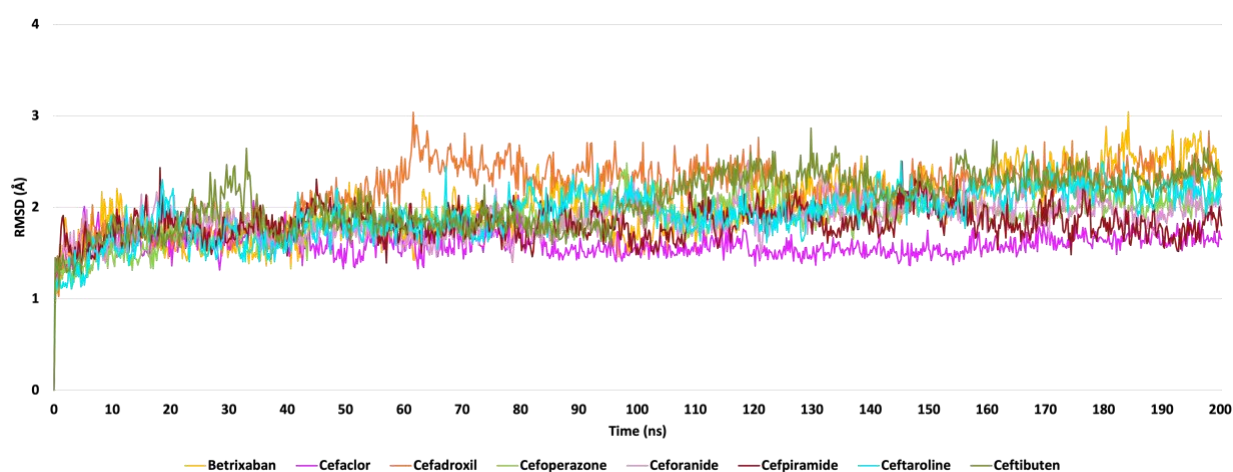
S1.



**Figure 1.** 3D representation of the binding modes of (A) betrixaban (yellow), (B) cefaclor (magenta), (C) cefadroxil (light orange), (D) cefoperazone (light green), (E) ceforanide (pink), (F) cefpiramide sodium (burgundy), (G) ceftaroline fosamil (cyan) and (H) ceftibuten (olive) complexed to the most representative receptor structure of SARS-CoV-2 Mpro. The protein is shown as forest cartoon, while the drugs are reported as sticks. The HBs, salt-bridge and stacking interactions are indicated as yellow, magenta and cyan dashed lines.

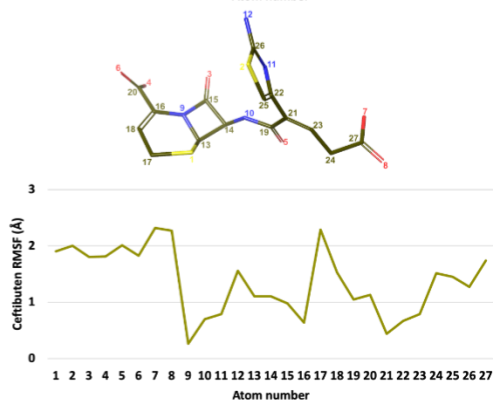
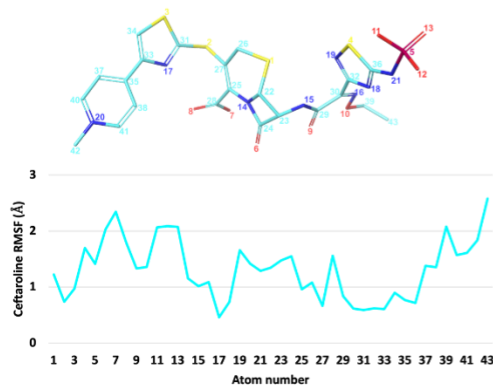
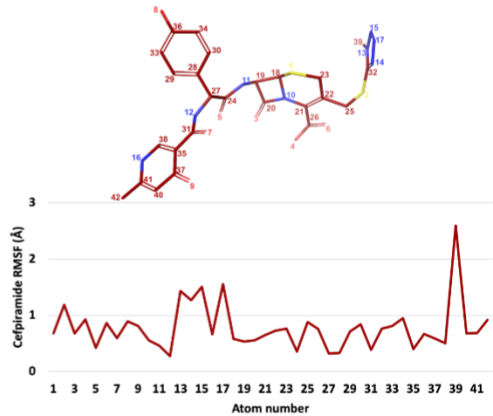
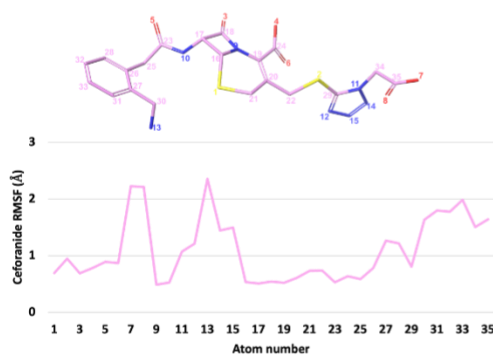
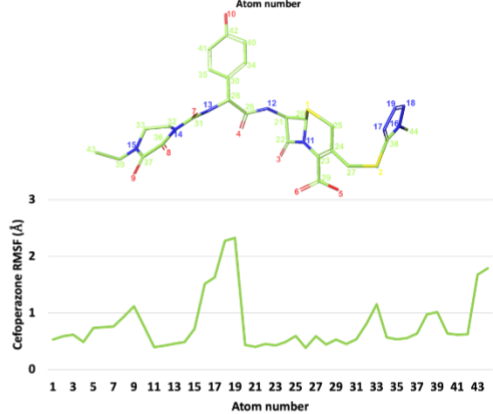
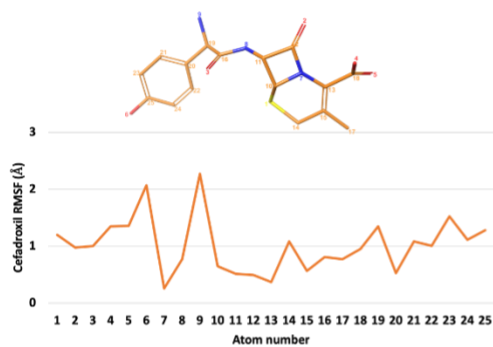
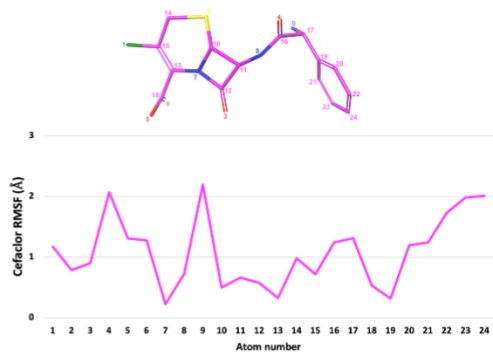
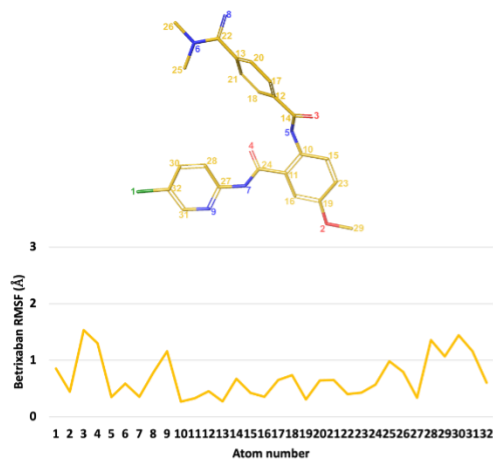
## Molecular dynamics analysis of the active compounds complexed to M<sup>pro</sup>

In order to further investigate the behaviour of the ligand-M<sup>pro</sup> complexes, 200 ns of Molecular Dynamics simulations (MDs) were performed starting from the docking pose of the 8 best candidates complexed to the most representative receptor structure of SARS-CoV-2 M<sup>pro</sup>. Desmond software,<sup>44</sup> with the parameters reported in the experimental section, was used for MDs. During the whole trajectory, for each complex, the protein backbone RMSD trend was calculated and as reported in Figure 2, betrixaban and all the cephalosporin derivatives were found to similarly stabilize the protein structure.



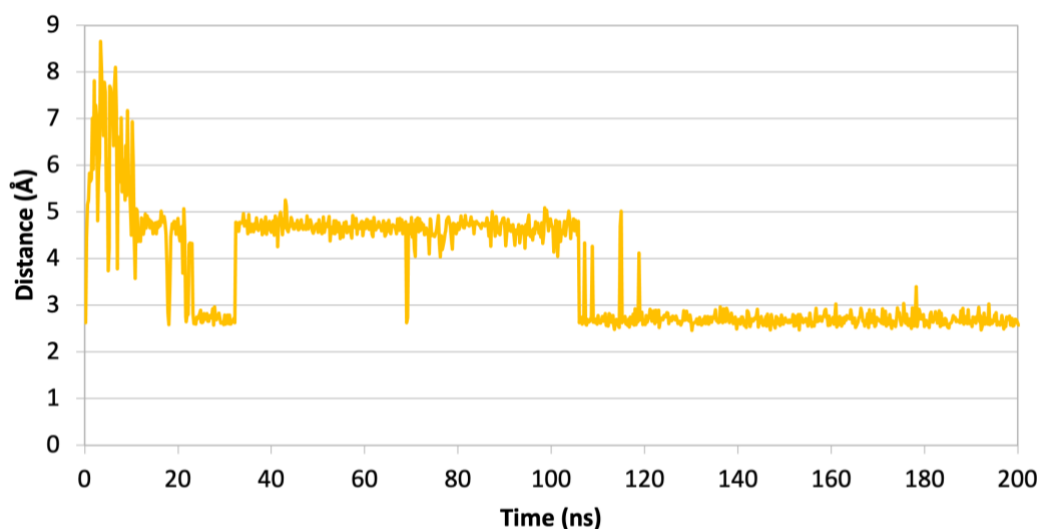
**Figure 2.** M<sup>pro</sup> protein backbone RMSD trend calculated in the presence of betrixaban (yellow line), cefaclor (magenta line), cefadroxil (light orange line), cefoperazone (light green line), ceforanide (pink line), cefpiramide sodium (burgundy line), ceftaroline fosamil (cyan line), and ceftibuten (olive line). The RMSD values are expressed in Å.

Moreover, for each ligand, we calculated the Root Mean Square Fluctuation (RMSF), in order to evaluate the ligand atom position changes during the whole simulation and the fluctuations of each ligand within the complex (Figure 3).



**Figure 3.** RMSF plots of (A) betrixaban (yellow line), (B) cefaclor (magenta line), (C) cefadroxil (light orange line), (D) cefoperazone (light green line), (E) ceforanide (pink line) and (F) cefpiramide sodium (burgundy line), (G) ceftaroline fosamil (cyan line), and (H) ceftibuten (olive line). The RMSF values expressed in Å, and the ligand atom number are reported on the ordinate and abscissa axes, respectively.

The general pattern of fluctuation was found to be moderately lower for betrixaban and cefoperazone compared to the other drugs. Specifically, as reported in Figure 4, we observed that, in the second part of the simulation, the distance between the oxygen atom of M<sup>pro</sup> Glu166 carboxylate and the protonated nitrogen atom of betrixaban carbamimidoyl group always stayed below 3 Å. The lower RMSF trend of the anticoagulant agent into the M<sup>pro</sup> binding pocket could be justified by its ability to maintain this pivotal salt-bridge interaction with Glu166 during MDs, thus assuring a remarkable electrostatic contribution in the complex stabilization.

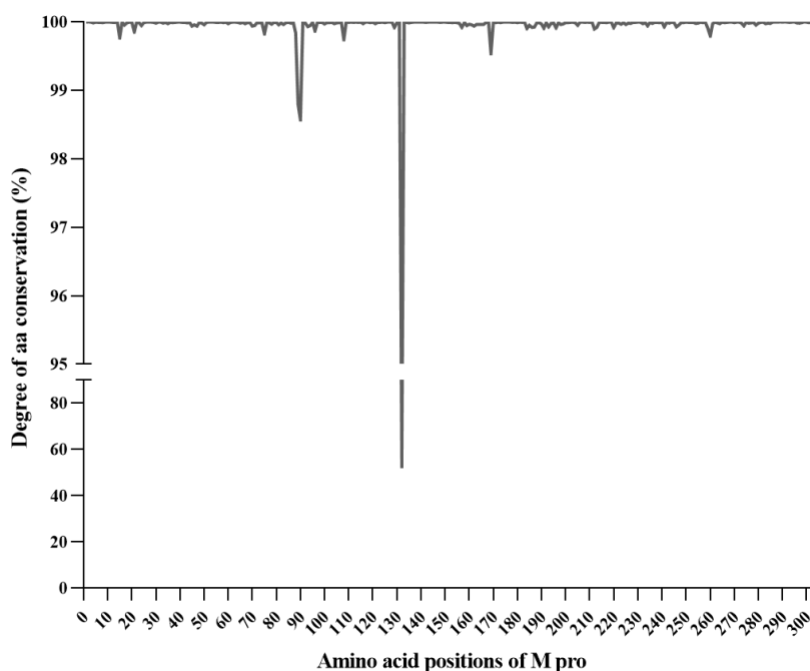


**Figure 4.** Monitoring of the distance between the oxygen atom of M<sup>pro</sup> Glu166 carboxylate and the protonated nitrogen atom of betrixaban carbamimidoyl group during the whole MDs. The distance is expressed in Å.

### Conservation analysis

The conservation analysis along with a comprehensive examination of SARS-CoV-2 M<sup>pro</sup> residues are crucial prior to identifying druggable targets and investigating antiviral compounds. In this light, a comprehensive analysis of the entire M<sup>pro</sup> was performed by using over 13.7 million SARS-CoV-2 sequences. The analysis revealed an extremely high degree of conservation in the entire M<sup>pro</sup>. In

particular, 62.4% (191/306) of residues never mutated, and 36.6% (112/306) were extremely conserved in >99.5% of the sequences analyzed (Figure 5). Among the remaining three residues, two (at residues 89 and 90) showed a substantial degree of conservation >98.5%, (Figure 5), with the mutations Leu89Phe and Lys90Arg being detected exclusively in the early variants as Beta and Delta.



**Figure 5.** Genomic plot reporting the genetic conservation of SARS-CoV-2 M<sup>pro</sup>. Dotted line represents the cut-off of amino acid conservation (95.5%) used to define highly conserved residues. The only three amino acid position characterized by a conservation<99.5% are reported in the graph.

Only one residue at position 132 was found to be frequently mutated in 47.5% of the sequences, mainly due to the occurrence of Pro132His, which characterizes the backbone of Omicron variants including the currently circulating subvariants BQ.x, and BF.x. Conversely, this mutation has never been detected in any of the previously circulating variants. Importantly, it is noteworthy to mention that Pro132His lies in a region between the catalytic (at positions 44 and 145) and the dimerization domains (at positions 301-306)<sup>45</sup> and does not cause any direct structural changes to the active site. In early 2022, during the surge of Omicron variant, a study showed that Pro132His led to decrease thermal stability of M<sup>pro</sup>

without compromising its catalytic activity or small-molecule drug inhibition.<sup>46</sup> Of note, the residue 166, that has been associated with Paxlovid resistance;<sup>47</sup> was extremely conserved in >99.9% of the analyzed sequences with mutations detected in about 5200 sequences (mostly Glu166Gln). More importantly, focusing our conservation analysis on the 50 residues localized in domains, that are crucial for the efficient binding of the tested compounds (aa: 19-28; 39-49; 117-120; 140-145; 163-172; 181 and 186-193), we found that 60% (30/50) of these residues never mutated, while 40% (20/50) were extremely conserved in >99.5%. These data again support the extreme degree of conservation of the M<sup>pro</sup>, particularly in those domains crucial for its enzymatic activity and that are targeted by the antiviral compounds emerged in this study, thus reinforcing the role of M<sup>pro</sup> as an appealing target for antiviral drugs, with broad spectrum activity against all SARS CoV-2 variants.

### SARS-CoV-2 replication assay of the candidate drugs

The ability of the most promising compounds in affecting SARS-CoV-2 replication has been assessed *in vitro* against the replication of SARS-CoV-2 in cell-based assays at 30  $\mu$ M. Among the 17 investigated compounds, betrixaban was able to significantly reduce the viral-induced cytopathic effect showing an EC<sub>50</sub> of  $28.5 \pm 2$   $\mu$ M, and not cytotoxicity at the highest concentration tested (Table 3).

**Table 3.** Viral replication assays.

| Compound            | SARS-CoV-2<br>EC <sub>50</sub> ( $\mu$ M) <sup>a</sup> | VEROE6-GFP<br>CC <sub>50</sub> ( $\mu$ M) <sup>b</sup> | SI   |
|---------------------|--------------------------------------------------------|--------------------------------------------------------|------|
| <b>Betrixaban</b>   | 28.5 $\pm$ 2.3                                         | >100 (92 %) <sup>d</sup>                               | >3.5 |
| <b>Cefaclor</b>     | >30 (92 %) <sup>c</sup>                                | >30 (92 %)                                             | ND   |
| <b>Cefadroxil</b>   | >30 (108 %)                                            | >30 (85 %)                                             | ND   |
| <b>Cefoperazone</b> | >30 (92 %)                                             | >30 (97 %)                                             | ND   |
| <b>Ceforanide</b>   | >30 (100 %)                                            | >30 (104 %)                                            | ND   |

|                             |             |              |      |
|-----------------------------|-------------|--------------|------|
| <b>Cefpiramide sodium</b>   | >30 (94 %)  | >30 (95 %)   | ND   |
| <b>Ceftaroline Fosamil</b>  | >30 (105 %) | >30 (105 %)  | ND   |
| <b>Ceftibuten dihydrate</b> | >30 (95 %)  | >30 (96 %)   | ND   |
| <b>Diosmin</b>              | >30 (103 %) | 44 %         | ND   |
| <b>Isavuconazole</b>        | >30 (92 %)  | >30 (94 %)   | ND   |
| <b>NADH</b>                 | >30 (97 %)  | >30 (93 %)   | ND   |
| <b>PF-03715455</b>          | >30 (100 %) | >30 (86 %)   | ND   |
| <b>PF-00610355</b>          | >30 (99 %)  | >30 (104 %)  | ND   |
| <b>Polydatin</b>            | >30 (106 %) | >30 (88 %)   | ND   |
| <b>Reproterol</b>           | >30 (89 %)  | >30 (100 %)  | ND   |
| <b>Rutin</b>                | >30 (92 %)  | >30 (99 %)   | ND   |
| <b>Zafirlukast</b>          | >30 (90 %)  | >30 (92 %)   | ND   |
| <b>GC376</b>                | 0.4 ± 0.2   | >100 (100 %) | >250 |

<sup>a</sup>EC<sub>50</sub> = concentration of compound that gives 50% rescue of the virus-reduced eGFP signals as compared to the untreated virus-infected control cells. <sup>b</sup>CC<sub>50</sub> = 50% cytotoxic concentration, as determined by measuring the cell viability. <sup>c</sup>Percentage of residual CPE at the highest concentration tested. <sup>d</sup>Percentage of residual cellular viability at the highest concentration tested. The values represent the means ± SD of data derived from duplicate experiments. SI = selectivity index calculated as the ratio between CC<sub>50</sub> and EC<sub>50</sub> of each compound.

COVID-19 induces thrombotic and thromboembolic events in infected patients, caused by excessive inflammation, endothelial cell activation and injury, platelet activation and hypercoagulability.<sup>48</sup> Independently of age, this complex scenario, known as COVID-19-associated coagulopathy (CoAC), is due to the thrombin generation and fibrinolysis shutdown, representing the causative factors in

establishing the environment for pulmonary micro and macrovascular thrombosis and negative consequences. Indeed, CoAC increases morbidity and mortality, especially in patients with acute respiratory distress syndrome.<sup>49</sup>

Our outcomes highlighted that betrixaban is able to block the SARS-CoV-2 replication and this result is of particular interest since betrixaban has been approved for thromboprophylaxis in hospitalized medically ill patients for its ability to significantly reduce asymptomatic and symptomatic Venous thromboembolism (VTE) and VTE-related deaths.<sup>50</sup> In addition, betrixaban is characterized by an important anticoagulant effect over 24 h, no contraindication in patients with severe renal insufficiency and a low propensity for drug-drug interactions.<sup>51</sup>

In line with these findings, betrixaban could be a good therapeutic option for thromboprophylaxis in hospitalized COVID-19 patients.<sup>52</sup>

## CONCLUSION

This study represents a successful example of *in silico* drug repurposing approach by which we identified 8 promising M<sup>pro</sup> inhibitors among the FDA already approved and investigational drugs. Indeed, among the 17 predicted best *hits*, 7 cephalosporins inhibited the M<sup>pro</sup> activity in the micromolar range (with 47 % of success) and the most potent compound, the oral anticoagulant betrixaban, was also able to inhibit the viral replication in the sub-micromolar range.

Due to its high degree of conservation, emerged from our analysis of >13 million SARS-CoV-2 sequences, M<sup>pro</sup> could be considered as an ideal target for antiviral therapy aiming to thwart the genetic evolution that SARS-CoV-2 is undergoing. Notably, we also demonstrated that a particularly high extent of conservation (>99.5%) characterizes protease residues, which are crucial for their enzymatic activity and for the binding of the antiviral compounds identified in this study, thus emphasizing their potential to guarantee a wide-spectrum effectiveness against all SARS-CoV-2 variants. Recent evidence has also confirmed previous data indicating that the M<sup>pro</sup> exhibits a significant degree of conservation across the

entire coronavirus family, supporting its role as target for compounds endowed of robust pancoronavirus antiviral activity,<sup>53</sup> thus critical in facing the emergence of novel coronaviruses.

Interestingly, the effect of betrixaban in affecting SARS-CoV-2 replication could be combined with its already known feature on preventing VTE, giving a positive contribution to the outcome of COVID-19 patients. Thus, considering its ability to reduce SARS-CoV-2 viral load and to prevent the thrombotic and thromboembolic events, our results could pave the way for a possible use of betrixaban in the treatment of hospitalized COVID-19 patients.

In conclusion, our *in silico* and *in vitro* data may provide information to drive medicinal chemistry projects to find more promising derivatives and/or evaluate the combination with other anti-SARS-CoV-2 drugs to potentiate their effects with respect to their original benefit.

## EXPERIMENTAL SECTION

**Molecular modeling.** Starting from the crystal structure of the complex resulting from the reaction between SARS-CoV-2 main protease and *tert*-butyl (1-((S)-1-(((S)-4-(benzylamino)-3,4-dioxo-1-((S)-2-oxopyrrolidin-3-yl)butan-2-yl)amino)-3-cyclopropyl-1-oxopropan-2-yl)-2-oxo-1,2-dihydropyridin-3-yl)carbamate (alpha-ketoamide 13b), deposited in the Protein Data Bank (PDB) with the PDB code 6Y2G,<sup>6</sup> our molecular modeling studies were carried out. To assess the accuracy and reliability of our docking protocol, firstly we performed re-docking calculations of the co-crystallized ligand by using Glide software v.6.7, with the Standard Precision (SP) algorithm, generating 10 poses per ligand.<sup>54</sup> In order to evaluate the geometrical reproduction of the experimental data, the Root Mean Square Deviation (RMSD) between the X-ray and the ligand best docking pose was analyzed (RMSD value equal to 1.665 Å).

The receptor structure was properly processed using the Protein Preparation Wizard tool.<sup>55</sup> Hydrogens were added and disulfide bonds were created. Missing side chains and missing loops were added using Prime. The hydrogen bonding network was optimized and the pK<sub>a</sub> values of the residues along with

their protonation state were calculated at pH 7.4.<sup>55</sup> The complex was then submitted to 10000 MacroModel energy minimization steps, using OPLS\_2005 as force field.<sup>56</sup>

In order to explore all the conformational states of the complex, 200 ns of Molecular Dynamics (MD) simulations were carried out. The MDs were run using Desmond package v5.3. The system was immersed in an orthorhombic box of TIP4P water molecules, extending at least 10 Å from the protein and counter ions were added to neutralize the system charge. The system temperature was set at 300 K and the NPT ensemble was selected.<sup>44</sup> The resulting trajectory was clustered with respect to the Root Mean Square Deviation (RMSD) in order to explore the collection of all the obtained structures, getting 4 representative structures, which were submitted to 10000 MacroModel energy minimization steps, using OPLS-2005 as force field.<sup>56</sup> All the obtained conformations were used for the further molecular recognition studies, carried out with Glide software v.7.8, by using the Standard Precision (SP) algorithm and by generating 10 poses per ligand.<sup>54</sup> The consensus docking score (D-score) was calculated for both energy minimized and not minimized structures. By comparing the obtained average values ( $D\text{-score}_{\text{av-min}} = -7.10$  kcal/mol and  $D\text{-score}_{\text{av-not min}} = -9.50$  kcal/mol), the best theoretical binding affinity was observed for the not minimized structures. After virtual screening studies, the obtained compounds were ranked according to their D-score value and, starting from the best theoretical binding affinity score, 200 compounds were selected. By means of a visual inspection and based on their commercial availability, 17 best *hits* were purchased and submitted to biological evaluations.

The best docking pose of the 8 selected compounds was submitted to 200 ns MDs. The MDs were carried out by applying the same protocol described above. The Simulation Interaction Diagram tool implemented in Desmond v. 3.8<sup>44</sup> was used to analyze the behavior of the ligands and the protein. The analysis included also the RMSD and RMSF calculations evaluated during the whole simulation.

For the virtual screening studies, we used a library of 8791 small molecules (approved drugs, experimental and investigational compounds, as well as nutraceuticals) obtained from the DrugBank

database.<sup>57</sup> The library was prepared using the LigPrep tool.<sup>58</sup> Hydrogens were added, salts were removed, and ionization states were calculated using Epik at pH 7.4. Each structure was submitted to 10000 MacroModel minimization steps using the OPLS\_2005 as force field.<sup>56, 59</sup>

**Pan Assay Interference compoundS (PAINS) evaluation.** The PAINS properties of the 8 active compounds were theoretically investigated by means of the ZINC PAINS Pattern Identifier web server.<sup>60</sup> The method did not highlight any PAINS related to the investigated molecules.

**SARS-CoV-2 Mpro Expression and Purification.** SARS-CoV-2 M<sup>pro</sup> was expressed and transformed in *E. coli* BL21 (DE3) cells, as described in Pelliccia S. *et al.* in 2022.<sup>61, 62</sup> The protein was purified using a two-step process. The purified protein fractions were pooled and subjected to buffer exchange (20 mM Tris-HCl, 150 mM NaCl, 1 mM EDTA, 1 mM DTT, pH 7.8) by using Amicon Ultra 15 centrifugal filters at 4000 x g, at 4 °C, aliquoted and stored at -80°C. The protein purity was checked by SDS-PAGE analysis.

**Determination of SARS-CoV-2 Mpro activity.** Enzymatic activity and inhibition of SARS-CoV-2 M<sup>pro</sup> was assessed using a FRET assay, as described in Kuzikow *et al.*<sup>55, 56</sup> Briefly, SARS-CoV-2 M<sup>pro</sup> was pre-incubated with different concentrations of the compounds at 37°C for 30 minutes, in a reaction mix containing 20 mM Tris-HCl pH 7.3, 100 mM NaCl and 1 mM EDTA. Subsequently, 12 µM of FRET substrate (peptide DABCYL- KTS AVLQ↓SGFRKM-EDANS) was added and the reaction was conducted at room temperature for 15 minutes, after which the fluorescent signal (ex/em 320/480) was acquired.

**Conservation analysis.** The SARS-CoV-2 genome sequences (N = 13,729,050) were retrieved until 12 Dec 2022 from the GISAID database and used to accurately define any amino acid substitution in the main protease (M<sup>pro</sup>) of SARS-CoV-2 (amino acid 1-306). By applying a stringent quality filter, only entire sequences with high quality were included in this study. High-quality sequences were defined as genomes of >29,000 nucleotides, characterized by the presence of <5% ambiguous nucleotides and

<0.05% unique amino acid mutations. The Bioedit software and MAFFT server were used to align sequences against the reference sequence (NC\_045512.2 SARS-CoV-2-Wuhan-Hu-1 isolate). Then, the alignments were split into different proteins to set apart M<sup>pro</sup> sequences. Sequences with a mixture of wild-type and mutant residues at single positions were considered to have the mutant(s) at that position. Finally, based on alignment conservation annotation, we measured the overall degree of M<sup>pro</sup> conservation by measuring the number of conserved amino acids for each column (position) of the alignment. To standardize the effect of the sequence, the prevalence of mutations at each amino acid positions was calculated based on total representative sequences while considering the sample size and margin of error; a 99.5% confidence interval was thus set as the limit for defining highly conserved positions.

**SARS-CoV-2 replication assay.** SARS-CoV-2 replication assay was performed according to the protocol reported by Corona *et al.* in 2021.<sup>63</sup> African green monkey kidney engineered cells were used to constitutively express GFP (Vero E6-GFP) provided by Janssen Pharmaceutical. SARS-CoV-2 strain BetaCov/Belgium/GHB-03021/2020 was provided by KU Leuven. GC376 compound<sup>64</sup> was used as positive control, in presence of 2 mM p-gp inhibitor CP-100356.<sup>65</sup> Assay was read at 72 hours post infection.

**Evaluation of cytotoxicity.** The assay was performed according to the protocol reported by Corona *et al.* in 2022<sup>63</sup> using Vero E6-GFP cells. Results were checked at 72 hours post infection.

## ASSOCIATED

## CONTENT

## DATA AND SOFTWARE AVAILABILITY

The library used for the Virtual Screening studies was downloaded from the DrugBank database (<https://go.drugbank.com>). The 2D structure, compound names and theoretical binding affinity values of the best compounds are provided in the manuscript. The molecular modeling strings of the active

compounds are provided in the Supporting Information. The name, average D-score, smile and IC50 value ( $\mu\text{M}$ ) of the active compounds are reported in an additional file (smiles.txt). All the ligands were prepared by means of the LigPrep tool (Schrödinger suite) using Epik-v4.3 at pH 7.4 and submitted to 10000 MacroModel-v11.9 minimization steps using OPLS\_2005 as force field (Schrödinger suite).

Schrödinger Suite 2018-1 ([https:// www.schrodinger.com](https://www.schrodinger.com)) is distributed under license.

The crystal structure of the complex resulting from the reaction between SARS-CoV-2 main protease and tert-butyl (1-((S)-1-(((S)-4-(benzylamino)-3,4-dioxo-1-((S)-2-oxopyrrolidin-3-yl)butan-2-yl)amino)-3-cyclopropyl-1-oxopropan-2-yl)-2-oxo-1,2-dihydropyridin-3-yl)carbamate ( $\alpha$ -ketoamide 13b) was retrieved from the Protein Data Bank (PDB ID: 6Y2G). Hydrogen atoms were added, and disulfide bonds were created. Missing side chains and missing loops were added using Prime. The hydrogen bonding network was optimized and the pKa values of the residues along with their protonation state were calculated at pH 7.4 by using Protein Preparation Wizard tool (Schrödinger suite). The complex was then submitted to 10000 MacroModel-v.11.9 energy minimization steps, using OPLS\_2005 as force field (Schrödinger suite). The molecular dynamics simulations were carried out using Desmond package v5.3. (Schrödinger suite). The docking studies were carried out by means of Glide-v.7.8 by using the Standard Precision (SP) (Schrödinger suite). The Pan Assay INterference compoundS (PAINS) evaluation was performed on the 8 active compounds by means of the ZINC PAINS Pattern Identifier web server ([zinc15.docking.org/patterns/home](http://zinc15.docking.org/patterns/home)).

## Supporting Information

The Supporting Information is available free of charge on the ACS Publications website.

Molecular modeling analysis: Table S1. Molecular Formula Strings of selected compounds. Figure S1: 2D representation of A) diosmin; B) isavuconazole; C) NADH; D) PF-00610355; E) PF-03715455; F) polydatin; G) reproterol; H) rutin; J) zafirlukast in complex with SARS-CoV-2 M<sup>pro</sup>.

PDB structure of M<sup>pro</sup>.

PDB complex of betrixaban in complex with M<sup>pro</sup>.

PDB complex of cefaclor in complex with M<sup>pro</sup>.

PDB complex of cefradroxil in complex with M<sup>pro</sup>.

PDB complex of cefoperazone in complex with M<sup>pro</sup>.  
PDB complex of ceforanide in complex with M<sup>pro</sup>.  
PDB complex of cefpiramide in complex with M<sup>pro</sup>.  
PDB complex of ceftaroline in complex with M<sup>pro</sup>.  
PDB complex of ceftibuten in complex with M<sup>pro</sup>.

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### **Notes**

Any additional relevant notes should be placed here.

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(Word Style "TD\_Acknowledgments"). Generally the last paragraph of the paper is the place to acknowledge people (dedications), places, and financing (you may state grant numbers and sponsors here). Follow the journal's guidelines on what to include in the Acknowledgement section.

## ABBREVIATIONS

SARS-CoV-2, severe acute respiratory syndrome coronavirus 2; COVID-19, coronavirus disease 2019; acute respiratory syndrome coronavirus (SARS-CoV); Middle East respiratory syndrome coronavirus (MERS-CoV); main protease ( $M^{\text{pro}}$ ); 3-chymotrypsin-like protease, 3CL $^{\text{pro}}$ ; papain-like protease ( $PL^{\text{pro}}$ ); RdRp, RNA-dependent RNA polymerase; polyprotein 1a (pp1a); 1ab (pp1ab); high-throughput screening (HTS); FDA, Food and Drug Administration; nicotinamide adenine dinucleotide (NADH); hydrogen bond (HB); Protein Data Bank (PDB); half maximal inhibitory concentration ( $IC_{50}$ ); Molecular Dynamics simulations (MDs); Root Mean Square Deviation (RMSD); standard precision (SP); docking score (D-score); substrate-binding subsites (S1, S2 and S4); hydrogen bonds (HBs); Root Mean Square Fluctuation (RMSF); Venous thromboembolism (VTE).

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