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# **Unraveling the SARS-CoV-2 Main Protease Mechanism**

## **Using Multiscale DFT/MM Methods**

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26 **Abstract**

27

28 We present a detailed theoretical analysis of the reaction mechanism of proteolysis catalyzed by  
29 the main protease of SARS-CoV-2. Using multiscale simulation methods, we have characterized  
30 the interactions established by a peptidic substrate in the active site and then we have explored  
31 the free energy landscape associated to the acylation and de-acylation steps of the proteolysis  
32 reaction, characterizing the transition states of the process. Our mechanistic proposals can  
33 explain most of the experimental observations made on the highly similar ortholog protease of  
34 SARS-CoV. We point out to some key interactions that may facilitate the acylation process and  
35 thus can be crucial in the design of more specific and efficient inhibitors of the main protease  
36 activity. In particular, from our results, the P1' residue can be a key factor to improve the  
37 thermodynamics and kinetics of the inhibition process.

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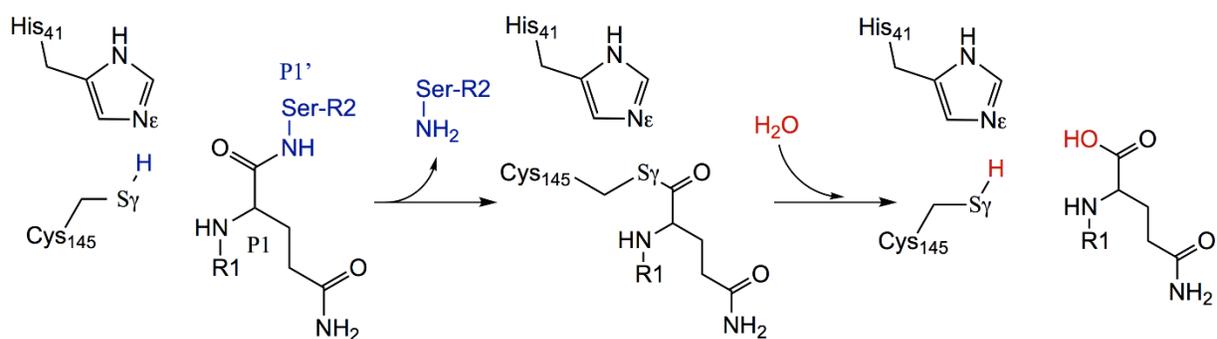
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41 The recent outbreak of COVID-19, a pneumonia-like illness caused by a coronavirus named as  
42 SARS-CoV-2<sup>1</sup>, has rapidly evolved into a pandemic as recognized by the World Health  
43 Organization. SARS-CoV-2 has been shown to be highly contagious, causing a large number of  
44 infections around the world. The absence of vaccines and specific treatments has contributed to  
45 a rapid spread of this disease and a fatal outcome in many cases. Furthermore, the existence of  
46 other similar virus detected in animals opens the possibility of future similar diseases.<sup>2,3</sup> Thus,  
47 finding effective strategies for the identification of potential targets for new drugs to fight against  
48 SARS-CoV-2 and other CoV-like virus is, nowadays, an urgent need. One of these strategies is  
49 based in the disruption of the activity of those enzymes that are crucial in the replication cycle of  
50 the virus using adequate compounds. In this sense, the knowledge of the catalytic activity of the  
51 enzyme at atomistic detail is one of the more powerful tools for efficient and specific new drugs  
52 design. In particular, the characterization and analysis of the geometry and electronic properties  
53 of the reaction Transition State (TS), can be used as a guide for the design of active site inhibitors.  
54 In this work we analyze the reaction mechanisms for the main protease of SARS-CoV-2, also  
55 referred to as 3C-like protease (3CL<sup>pro</sup>) using DFT-based multiscale methods. This enzyme plays  
56 an essential role during the replication of the virus and has not closely related homologues in  
57 human beings, making it an attractive drug target<sup>4</sup>.

58  
59 The 3CL<sup>pro</sup> enzyme of SARS-CoV-2 exists as a functional homodimer with two active sites in  
60 charge of cleaving the translated polyproteins into individual fragments to be used by the  
61 coronavirus<sup>5</sup>. As other cysteine proteases, each of the active sites contains a Cys-His catalytic  
62 dyad in charge of the hydrolysis of the peptide bond at specific sites of a polypeptide chain.  
63 Several structures of this protease have been already resolved by means of x-ray crystallography  
64 and deposited in the Protein Data Bank (PDB), including the free protease (PDB codes 6Y2E<sup>2</sup>  
65 and 6Y84<sup>6</sup>) and inhibitor bound proteases (PDB codes 6LU7<sup>6</sup>, 6Y2F<sup>7</sup> and 6LZE<sup>8</sup>). The SARS-  
66 CoV-2 main protease has a structure virtually identical to the ortholog from SARS-CoV (96%  
67 identity). Even more, the main residues involved in catalysis, binding and dimerization processes  
68 are fully conserved<sup>9</sup>. Consequently, these two ortholog enzymes display highly similar substrate  
69 preferences<sup>10</sup>. The substrate cleavage by the 3CL<sup>pro</sup> takes place between Gln at the P1 position  
70 and a Gly/Ala/Ser at the P1' one (P and P' identify the residues placed before and after the scissile  
71 bond, respectively), being the presence of Gln an essential requirement<sup>11</sup>.

72

73 In principle, the reaction mechanism of cysteine proteases involves two basic steps (see Scheme  
 74 1)<sup>12</sup>. In the first step, acylation, the peptide bond is broken, releasing the P' fragment of the  
 75 peptidic substrate and forming an acyl-enzyme complex where the catalytic cysteine (Cys145 in  
 76 the protease of SARS-CoV-2) is covalently bound to the carbon atom of the P1 residue of the  
 77 target peptide. In a second step, de-acylation, the acyl-enzyme is hydrolyzed, releasing the P  
 78 fragment and recovering the enzymatic active site for another catalytic cycle. Covalent inhibitors  
 79 of the protease activity form acyl-enzyme complexes that cannot be hydrolyzed, remaining  
 80 bonded into the active site<sup>13,14</sup>. In this work we take benefit of the similarities between the  
 81 proteases of SARS-CoV and SARS- CoV-2 viruses and the existence of ligand-bound structures  
 82 to build a structural model of a peptide substrate-enzyme Michaelis complex and to study the  
 83 reaction mechanism using computational simulations.



84  
 85 **Scheme 1**  
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## 88 Results

89 As detailed in the Methods section we carried out Molecular Dynamics (MD) simulations (3  
 90 replicas) of the peptide substrate-protease complex built from the 6Y2F PDB structure<sup>7</sup>. The  
 91 chosen substrate for our simulation, Ac-Ser-Ala-Val-Leu-Gln-Ser-Gly-Phe-NMe, was selected  
 92 from a structure of the SARS-CoV protease structure. For this substrate, the proteolysis takes  
 93 place in the Gln(P1)-Ser(P1') bond. A total of 10  $\mu$ s of classical simulations were run using the  
 94 AMBER19 GPU version of *pmemd*<sup>15,16</sup>. We then explored the reaction mechanism using  
 95 multiscale simulation methods at the B3LYPD3/MM level, with the 6-31+G\* basis set, as  
 96 explained in Methods section. The string-method<sup>17,18</sup> was employed to find the minimum free  
 97 energy paths (MFEP) on multidimensional free energy surfaces and to trace the associated free  
 98 energy profiles.

99

## 100 **Enzyme-Substrate Complex**

101 The time evolution of the root mean square deviation (RMSD) values for each replica (2 protomers  
102 and 2 substrates in each replica) are shown in Figure S1. These values show that the protein  
103 structure is well-equilibrated and there are no large differences with respect to the initial  
104 structures, prepared from the x-ray data. The observations made on the three replicas (one of 8  
105  $\mu\text{s}$  and two of 1  $\mu\text{s}$ ) are very similar in all cases. The substrate-binding pocket is divided into a  
106 series of subsites (denoted as S and S'), each accommodating a single residue of the substrate  
107 placed before (P) or after (P') the scissile peptide bond. The map of hydrogen bond interactions  
108 observed during our MD simulations of the Michaelis complex is given in Figure 1a, a general  
109 view of the substrate in the two active sites of the dimer formed by protomers A and B is shown  
110 in Figure 1b, while an insight into the active site of protomer A is provided in Figure 1c. The 3CL<sup>pro</sup>  
111 of SARS-CoV-2 (as is also the case of the SARS-CoV ortholog) presents a high specificity for Gln  
112 at P1 position<sup>11,19</sup>. As seen in Figure 1a the P1 residue is the one establishing more hydrogen  
113 bond interactions with the enzyme. The O and N main chain atoms of Gln-P1 are found to make  
114 hydrogen bonds with main chain atoms of Gly143, Ser144 and His164 (unless indicated all the  
115 residues of the protein belong to the same protomer A). Regarding the side chain of Gln-P1, this  
116 is accommodated into the S1 subsite through hydrogen bond contacts with the main chain atoms  
117 of Phe140 and Leu141, with the N $\epsilon$  atom of His163 and the O $\epsilon$  atoms of Glu166. This last residue  
118 is in turn hydrogen bonded to the terminal NH group of Ser1 from protomer B. In fact, the N-  
119 terminal fragment (N-finger) of protomer B plays an active role pre-organizing the active site of  
120 protomer A for catalysis<sup>20</sup>. Dimerization is an essential condition for catalysis in the protease of  
121 related coronavirus<sup>19,21,22</sup> and, consequently, those mutants lacking the N-finger fragment are  
122 almost completely inactive<sup>23</sup>. The side chain of Leu-P2 is surrounded by the side chains of His41,  
123 Met49, His164, Met165 and Asp187, while the main chain amide group is hydrogen bonded to  
124 the O $\epsilon$  atom of Gln189. The side chain of Val-P3 is solvent-exposed, while main chain N and O  
125 atoms are hydrogen bonded to main chain atoms of Glu166.

126

127 The binding subsite for Ala-P4 is constituted by main chain interactions with Gln189 and Thr190,  
128 while the side chain of this residue is placed between the side chains of Met165, Leu167 and  
129 Pro168. The S5 subsite is formed by the side chain of Pro168 and by main chain atoms of Thr190.  
130 This description of the S1-S5 interaction subsites that have been observed in our simulations

131 agrees with the descriptions found in the x-ray structures of SARS-CoV-2 3CL protease with  
132 inhibitor bounds in the active site<sup>8,13,14</sup>. Our MD simulations of the substrate-enzyme complex  
133 offers, in addition, a detailed description of the S' subsites, those that accommodate the P'  
134 residues placed after the scissile peptide bond. The main chain O atom of Ser-P1' establishes a  
135 hydrogen bond with the amide group of Gly143 and the side chain of Asn142. The hydroxyl group  
136 of the P1' side chain can contact with the catalytic dyad (Cys145 and His41) while the CH<sub>2</sub> group  
137 is packed between Thr25, Thr26 and Leu27. Gly-P2' is stabilized through main chain contacts  
138 with Thr25 and Thr26. Finally, the side chain of Phe-P3' residue is packed against the side chain  
139 of Thr24. This structural information can be useful in order to improve the binding and specificity  
140 of potential inhibitors of the protease activity because these structural findings are lost in the x-  
141 ray structures obtained from those inhibitors in which the fragment corresponding to P' residues  
142 either is released during the formation of the acyl-enzyme complex<sup>14</sup> or is smaller than in our  
143 substrate<sup>8,13</sup>.

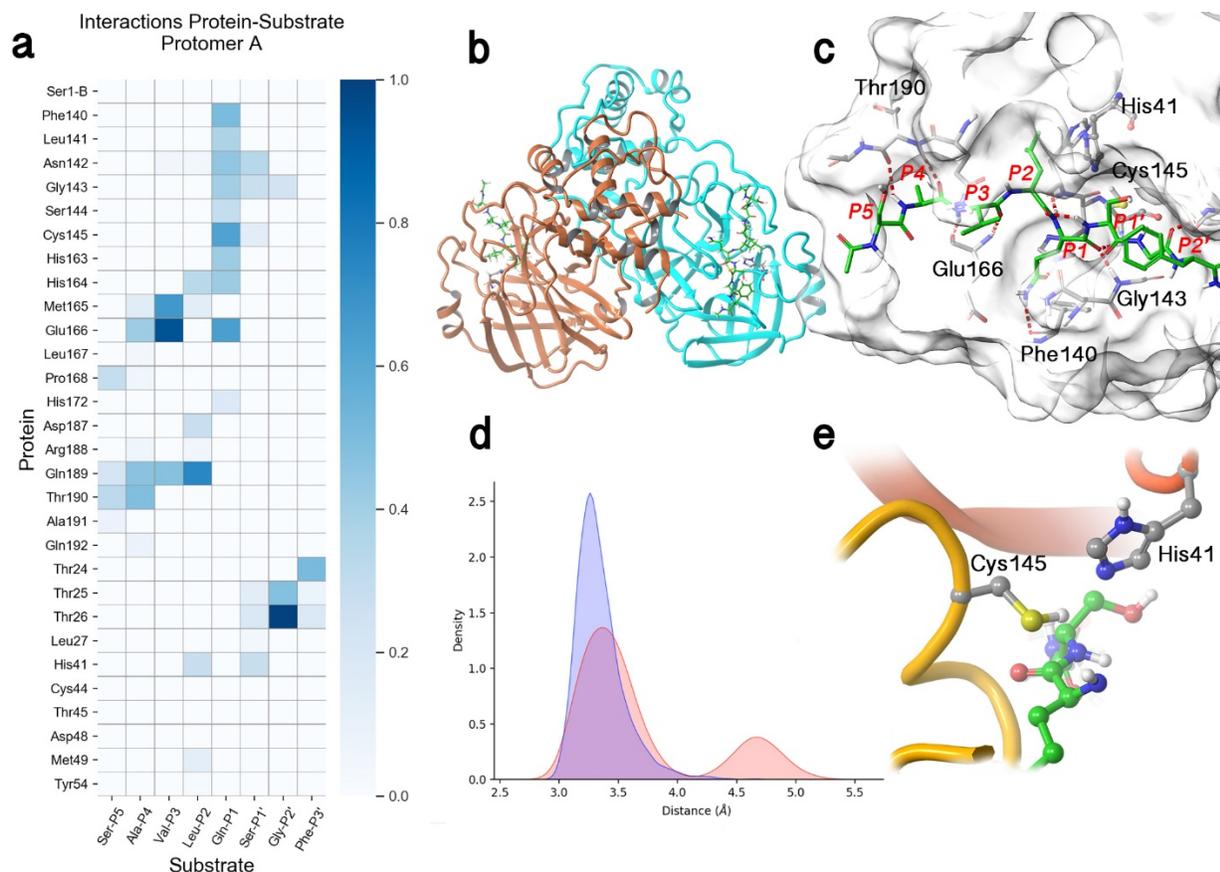
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 150 **Figure 1.** Results of the Molecular Dynamics simulation of 3CL<sup>pro</sup> of SARS-CoV-2 in complex with the  
 151 substrate with sequence Ac-Ser-Ala-Val-Leu-Gln-Ser-Gly-Phe-NMe. (1a) Fraction of hydrogen bond  
 152 contacts between the residues of the substrate and those of the protease found during the trajectory of the  
 153 Michaelis Complex. A hydrogen bond contact is counted when the donor-acceptor distance is < 3.8 Å and  
 154 the hydrogen bond angle is > 120°. (1b) General overview of the substrate-enzyme complex, showing the  
 155 dimeric nature of the protease with two identical active sites occupied by the substrate. Note that the N-  
 156 finger of each protomer is close to the active site of the neighbor protomer. (1c) Insight into the binding  
 157 pose of the peptide substrate into the active site, showing the most important active site residues and the  
 158 positions occupied by the P and P' residues of the substrate. (1d) Probability densities of the distances  
 159 from the Cys145-S<sub>γ</sub> atom to the carbonyl carbon atom of the substrate (C(P1)), in red, and to the N<sub>ε</sub> atom  
 160 of His41, in blue. The bimodal distribution of S<sub>γ</sub>-C(P1) distances correspond to the *trans* (shorter distances)  
 161 and *gauche* (longer distances) conformations of Cys145. (1e) Disposition of the substrate in the vicinity of  
 162 the catalytic dyad when Cys145 is present in the *trans* conformation. Note the proximity between S<sub>γ</sub> and  
 163 C(P1) atoms and the orientation of the sulfhydryl proton towards the N<sub>ε</sub> atom of His41.  
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## 165 **The Catalytic Dyad**

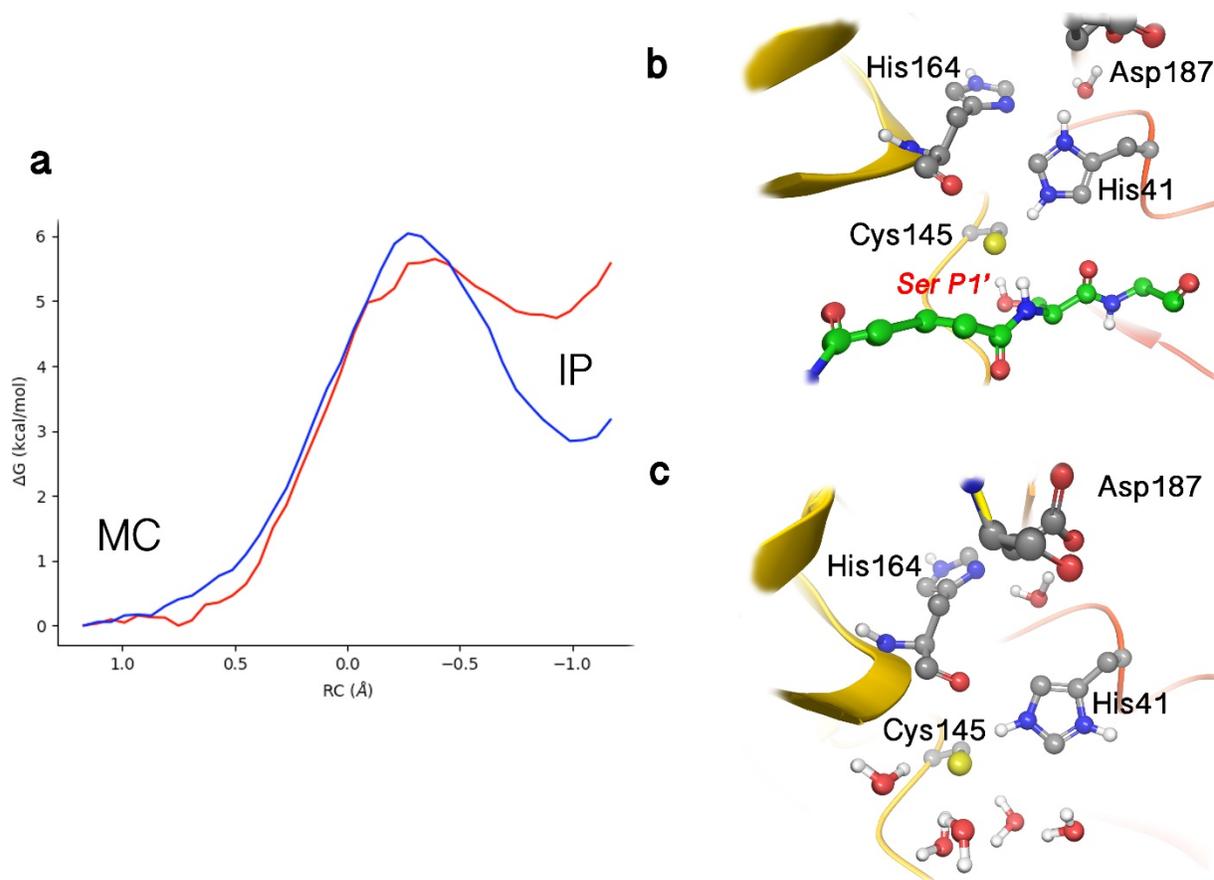
166 The reaction mechanism of cysteine proteases involves the nucleophilic attack of the S $\gamma$  atom of  
167 a cysteine (Cys145 in our case) to the C(P1) atom of the peptide bond. Figure 1d shows the  
168 probability distribution of S $\gamma$ -C(P1) distances found during our MD simulations. The distribution is  
169 clearly bimodal, with two peaks centered at 3.4 and 4.7 Å. These two peaks correspond to two  
170 different conformations of the side chain of Cys145, which can be present in *trans* and *gauche*  
171 conformations. This is in agreement with the observations made on the x-ray structure of the  
172 orthologue protease of SARS-CoV<sup>20</sup>. The most probable conformation corresponds to the *trans*  
173 conformer in which the S $\gamma$  sulfur atom is closer to the substrate (see Figure 1e). In both  
174 conformations the catalytic dyad remains hydrogen bonded, being the most probable distance  
175 between Cys145-S $\gamma$  and His41-N $\epsilon$  of about 3.3 Å (see Figure 1d). Interestingly, His41 is, in turn,  
176 hydrogen bonded, through a highly conserved crystallographic water molecule, to Asp187. This  
177 interaction can raise the pK<sub>a</sub> of the histidine, increasing its ability to work as a base and abstract  
178 the proton from Cys145.

179  
180 Considering the short distance observed between Cys145 and His41 and the possible activation  
181 of this last residue by the nearby Asp187, we explored the possibility to find the catalytic dyad  
182 forming an ion pair (Cys/HisH<sup>+</sup> or IP in Figure 2) instead of the neutral form modelled in the  
183 Michaelis complex (CysH/His or MC in Figure 2). We evaluated the free energy difference  
184 between these two forms of the dyad by means of free energy profiles associated to the proton  
185 transfer coordinate from Cys145 to His41 obtained at the B3LYPD3/MM level (see Methods). The  
186 proton transfer free energy profiles (Figure 2a) were obtained for the holo and apo forms of 3CL<sup>pro</sup>.  
187 According to Figure 2a the catalytic dyad is more stable in its neutral form, both for the apo and  
188 holo forms. The IP is 2.9 and 4.8 kcal·mol<sup>-1</sup> above the neutral form, in the apo and holo enzymes,  
189 respectively. The anionic Cys145 can be stabilized by the presence of water molecules and by  
190 the hydroxyl group of Ser-P1' (see Figure 2b). Bulkier residues at the P1' position could hinder  
191 the access of water molecules and thus destabilize the unprotonated form of Cys145. This could  
192 be one of the factors explaining the preference of 3CL<sup>pro</sup> for small residues at the P1' position  
193 (Ser/Ala/Gly). According to our free energy profiles shown in Figure 2a the IP form is better  
194 stabilized with respect to the neutral dyad in the apo enzyme than in the holo one (by almost 2  
195 kcal·mol<sup>-1</sup>), which can be related to the better solvation of the anionic cysteine in the former. In  
196 both the holo and apo enzymes, the free energy barrier associated to the transfer of the proton

197 between His41 to Cys145 is small, revealing a fast equilibrium between the ion pair and neutral  
 198 versions of the dyad, being the latter the predominant form. The existence of a low-lying IP dyad  
 199 is compatible with the experimental observations made in the kinetic characterization of the highly  
 200 homologue 3CL<sup>pro</sup> of SARS-CoV, in which an ion pair mechanism for the proteolysis was  
 201 proposed on the basis of the pH-inactivation profile with iodoacetamide and the analysis of solvent  
 202 isotope effects<sup>24</sup>.

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206 **Figure 2.** Analysis of the formation of an ion pair (IP) catalytic dyad (Cys145 $\cdots$ His41H<sup>+</sup>) from the neutral  
 207 form (Cys145H $\cdots$ His41) found in the Michaelis Complex (MC). (2a) B3LYPD3/6-31+G\*/MM free energy  
 208 profile associated to the proton transfer coordinate from the S $\gamma$  atom of Cys145 to the N $\epsilon$  atom of His41  
 209 ( $d(N\epsilon-H)-d(S\gamma-H)$ ) in the apo (blue line) and holo (red line) enzymes. (2b) Representation of the ion pair in  
 210 the holo enzyme, showing those interactions stabilizing the charged states of the catalytic dyad, in particular  
 211 the hydroxyl group of Ser(P1'). (2c) Representation of the ion pair in the apo enzyme, showing the presence  
 212 of water molecules stabilizing the charged catalytic dyad when the substrate is absent.

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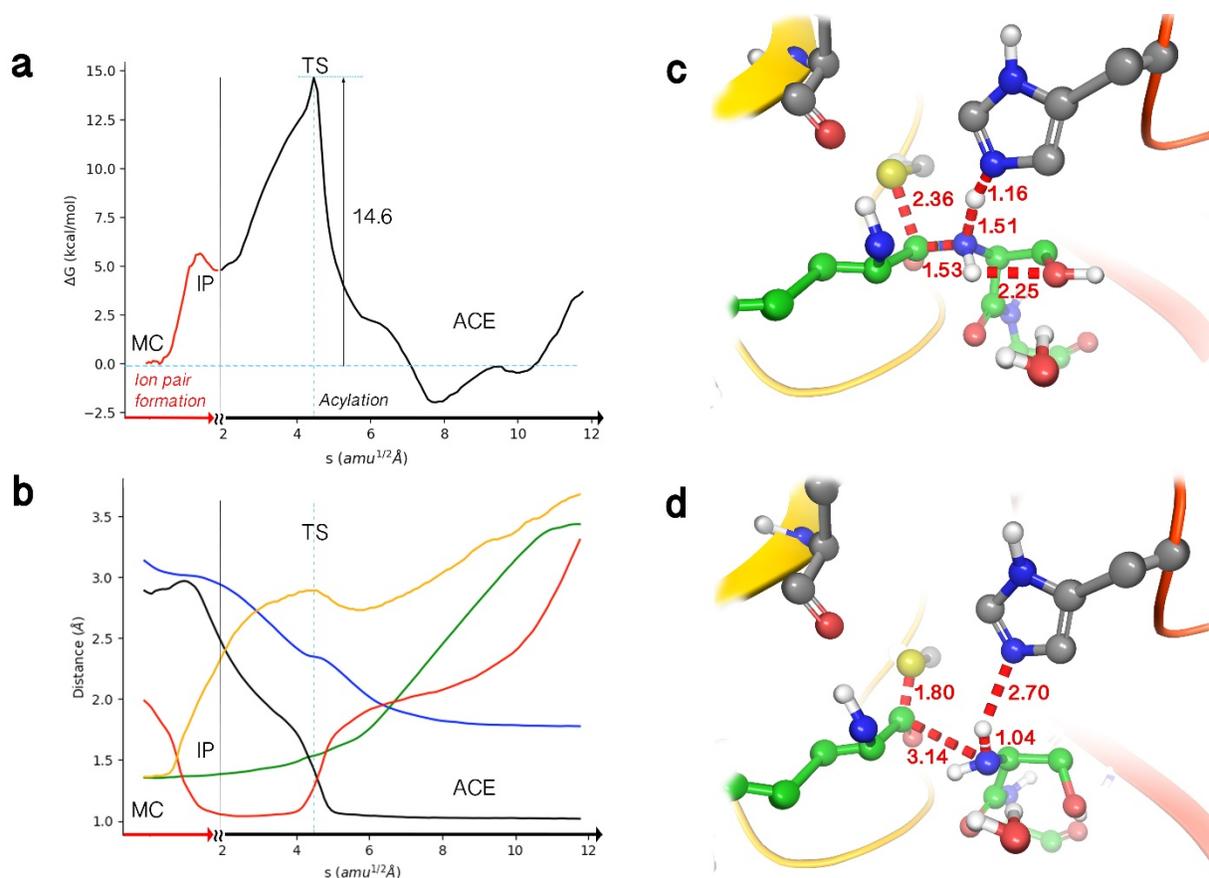
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### ***The Acylation step***

We explored the free energy landscape for the formation of the acyl-enzyme starting from the catalytic dyad IP at the B3LYPD3/MM level. The converged MFEP is shown in Figures 3a-b. According to our simulations, after ion pair formation, the acylation proceeds by means of a proton transfer from His41 to the N(P1') atom followed by the nucleophilic attack of Cys145-S $\gamma$  on the C(P1) atom and the simultaneous breaking of the C(P1)-N(P1') peptide bond. These elementary events take place in a concerted but asynchronous way. The transition state (TS) found for this mechanism (see Figure 3c) is associated to the proton transfer from His41 to the amide nitrogen atom of the peptide bond N(P1'). At the TS the S $\gamma$  atom of Cys145 approaches to the C(P1) atom, reducing the interatomic distance from 3.11 to 2.34 Å. This approach is accompanied by a moderate lengthening of the peptide bond (the C(P1)-N(P1') distance being lengthened from 1.36 to 1.54 Å). According to the free energy path shown in Figure 3a, the total free energy barrier associated to the acylation process, including the free energy cost of the ion pair formation, is of 14.6 kcal·mol<sup>-1</sup>. This value is compatible with the activation free energies derived from the steady-state rate constants measured at 25° C for peptides cleaved at the Gln-Ser bond by the highly similar ortholog 3CL<sup>pro</sup> of SARS-CoV (between 16.2 and 17.2 kcal·mol<sup>-1</sup>)<sup>24</sup>. It must be noticed that in this proteolysis the acylation step is not considered to be the rate-limiting one and then these experimental activation free energies provide an upper limit for the acylation barrier<sup>24</sup>. Figure 3c shows that this TS is stabilized by means of a hydrogen bond interaction with the hydroxyl group of SerP1', indicating, also in agreement with the experimental observations, that the leaving group plays an important role in catalysis. Remarkably, the proposed reaction mechanism is also in good agreement with the experimental proton inventory results, that indicate that there are two protons in flight during the acylation, one at the TS and another one at earlier stages<sup>24</sup>. In our picture these two proton transfers events correspond to the proton transferred from His41 to the N(P1') atom of the substrate at the TS and the proton transfer from Cys145 to His41 during IP formation. Regarding the acyl-enzyme product (Figure 3d), our free energy profile shows two possible conformations that differ in the presence of a water molecule that plays a key role during de-acylation (see Figure S2). Finally, in our free energy profile the formation of the acyl-enzyme (see Figure 3d) is almost thermo-neutral, with a reaction free energy of about -1 kcal·mol<sup>-1</sup>.



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250 **Figure 3.** Simulation of the acylation reaction taking place through the formation of the ion pair. **(3a)**  
 251 B3LYPD3/6-31+G\*/MM free energy profile along the path-CV for the acylation reaction after the formation  
 252 of the ion pair (IP) from the Michaelis complex (MC). The reaction takes place with a single transition state  
 253 (TS) that yield the acyl-enzyme (ACE), which can be present in two conformations. **(3b)** Evolution of the  
 254 distances selected as Collective Variables (CVs) along the Minimum Free Energy Path (MFEP).  $S_{\gamma}$ -H in  
 255 yellow,  $H-N_{\epsilon}$  in red,  $C(P1)-N(P1')$  (the scissile peptide bond) in green,  $H-N(P1')$  in black,  $S_{\gamma}-C(P1)$  in blue.  
 256 **(3c)** Representation of the TS for the acylation process. This TS corresponds to the proton transfer from  
 257 His41 in the ion pair catalytic dyad to the nitrogen atom of peptide bond ( $N(P1')$ ) with the approach of the  
 258  $S_{\gamma}$  atom of Cys145 to the carbonyl carbon atom ( $C(P1)$ ) and the lengthening of the peptide bond. The  
 259 values of the distances correspond to the coordinates of the MFEP at the TS, except the intramolecular  
 260 distance between the hydroxyl and NH group of Ser( $P1'$ ) that has been averaged over the trajectory of the  
 261 corresponding string node. **(3d)** Representation of the acyl-enzyme complex formed between the enzyme  
 262 and the P fragment of the peptide, with a water molecule hydrogen bonded to the N-terminal group of the  
 263 P' fragment. The free energy profile shows two minima for the acyl-enzyme complex, differing in the  
 264 distance between the P and P' fragments, as shown in Figure S2.

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268 Very recently an interesting QM/MM study of the same protease with a different substrate (where  
269 the leaving group was not a peptide fragment but a fluorescent tag, 7-amino-4-  
270 carbamoylmethylcoumarin) has been reported<sup>25</sup>. In that work the proton transfer from Cys145 to  
271 His41 was found to be concomitant with the nucleophilic attack of the S<sub>γ</sub> atom on the carbonyl  
272 carbon atom, forming a thiohemiketal intermediate and the cleavage of the peptide bond takes  
273 place in a subsequent step assisted by the proton transfer from His41. The differences with  
274 respect to our results could be due to the use of a non-peptidic leaving group and/or the use of  
275 different theoretical descriptions (that work used a combination of semiempirical and DFT  
276 methods with the M06-2X functional). In any case, that study obtained an activation free energy  
277 of 19.9 kcal·mol<sup>-1</sup>, in excellent agreement (within 0.5 kcal·mol<sup>-1</sup>) with the value derived from the  
278 experimental rate constant obtained for that substrate<sup>10</sup>. Interestingly, this rate constant (0.050 s<sup>-1</sup>)<sup>10</sup>  
279 is significantly smaller than the value reported for the hydrolysis of the Gln-Ser bond by the  
280 ortholog enzyme of SARS-CoV (1.5-8.5 s<sup>-1</sup>)<sup>24</sup>. The gap between these two experimental rate  
281 constant values could be due to differences in the preparation and purification of the enzyme or  
282 to genuine mechanistic differences between substrates in the main protease<sup>24,26</sup>. In this sense,  
283 as discussed above, the presence of a hydroxyl group at P1' position could play an important role  
284 in the acylation process, improving the binding and kinetics of a hypothetical inhibitor.

285  
286 In order to explore other possible mechanisms<sup>27</sup> we also studied a reaction path that does not  
287 involve the formation of an ion pair, although the associated free energy barrier is considerably  
288 higher and incompatible with the experimental rate constant (see Figure S3).

289

### 290 ***The De-acylation step***

291  
292 Regarding the de-acylation step, the standard mechanistic proposal suggested for related  
293 enzymes<sup>28</sup> assumes that once the neutral P'-NH<sub>2</sub> peptide fragment has left the active site, a water  
294 molecule activated by His41 attacks the C(P1)-S<sub>γ</sub> bond, releasing the P-COOH peptide (also with  
295 a neutral terminal group) and, finally, regenerating the enzyme after a proton transfer from His41  
296 to Cys145 (see Scheme 1). In our simulations of the acylation product we found that a water  
297 molecule can be placed in between the P'-NH<sub>2</sub> leaving fragment and the acyl-enzyme complex,  
298 being correctly oriented to perform the hydrolysis of the acyl-enzyme (see Figure 3d and Figure  
299 S2). This configuration suggests an alternative reaction mechanism that can yield the two peptide

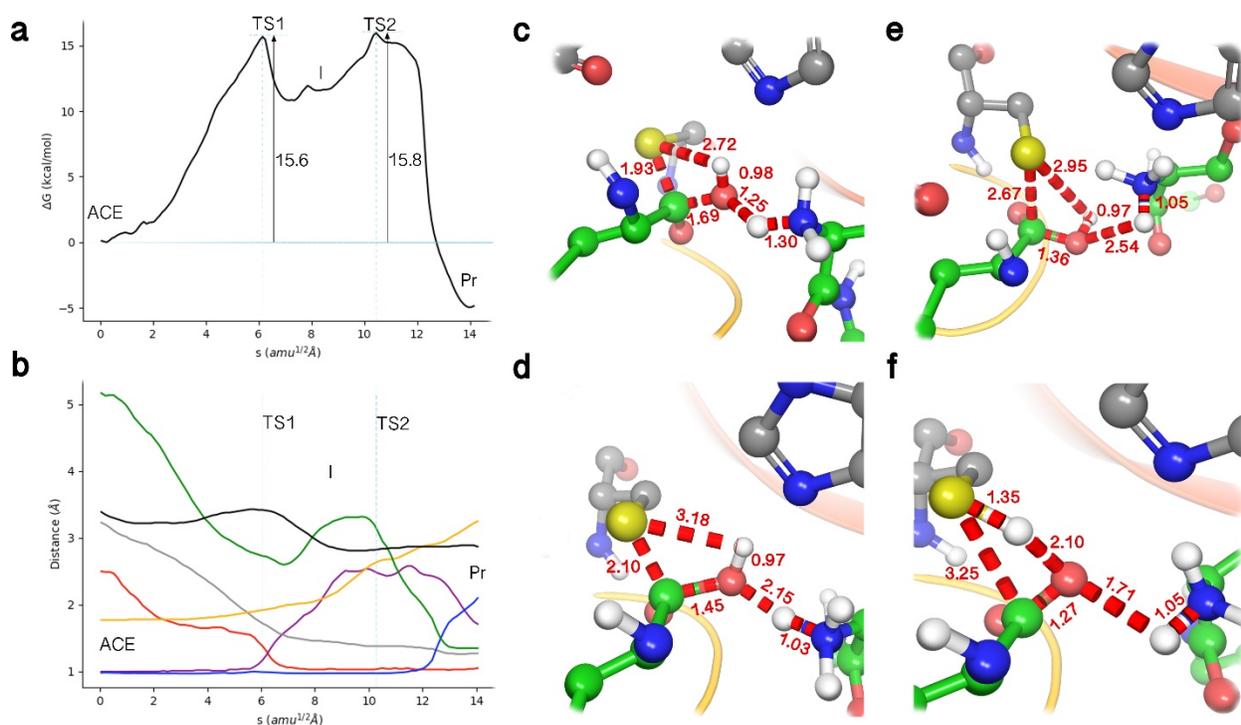
300 fragments with correct protonation states in the terminal groups and regenerate the enzymatic  
301 active site in its most stable state (the neutral catalytic dyad). An additional advantage of this  
302 novel mechanism is that involves water activation by means of the N-terminus of the P' fragment,  
303 which is known to be a better base than histidine side chains (the average  $pK_a$  values are about  
304 7.7 and 6.6, respectively)<sup>29</sup>. Finally, the proposed mechanism can be at the origin of the  
305 differences observed when the scissile bond is an amide instead of an ester (in that case a basic  
306 N-terminal group is not formed after the acylation).<sup>24</sup> We obtained the MFEP corresponding to  
307 such a mechanism at the B3LYPD3/MM level (see Figure 4). This process is stepwise, presenting  
308 two TSs (see Figure 4a). The first TS (TS1 in Figure 4c) corresponds to the proton transfer from  
309 the water molecule to the N(P1') atom, resulting in the formation of the P'-NH<sub>3</sub><sup>+</sup> peptide fragment.  
310 The free energy barrier associated to this step is of 15.6 kcal·mol<sup>-1</sup>, in excellent agreement with  
311 the values derived from the reaction rate constants for the ortholog protease of SARS-CoV (from  
312 16.2 to 17.2 kcal·mol<sup>-1</sup>).<sup>24</sup> This proton transfer is concomitant to the attack of the hydroxyl group  
313 on the C(P1) carbonyl carbon atom, resulting in the formation of an intermediate thiodiolate  
314 (Figure 4d). After rotation of the hydroxyl group to orient the proton towards the sulfur atom, the  
315 reaction proceeds with the cleavage of the C(P1)-S<sub>γ</sub> bond. The second TS observed during the  
316 de-acylation (TS2, Figure 4e), corresponds to the separation of the S<sub>γ</sub> atom (the C(P1)-S<sub>γ</sub>  
317 distance being 2.67 Å). The free energy barrier associated to this second step from the acyl-  
318 enzyme complex is very close to the first one, 15.8 kcal·mol<sup>-1</sup>. Afterwards, the leaving cysteine is  
319 stabilized by means of a proton transfer from the C-terminal group to the S<sub>γ</sub> atom, regenerating  
320 the enzyme in its more stable protonation state (a neutral catalytic dyad) and yielding the P  
321 peptide fragment with a terminal unprotonated carboxylate (the product is represented in Figure  
322 4f). The proposed mechanism, in which the general base is a N-terminal group, displays a smaller  
323 barrier than the standard mechanism in which His41 acts as the general base activating the water  
324 molecule, as expected from the relative  $pK_a$  values (see Figure S4).

325  
326 It is worth noticing that the peptide fragments obtained from this mechanistic proposal present a  
327 salt-bridge between the charged C-terminal and N-terminal groups that must be broken during  
328 products release. The separation of the two terminal groups implies that water molecules must  
329 be placed, tightly bounded, between these two charged groups. Those configurations could  
330 contribute to an inverse solvent isotope effect observed under steady state conditions only when

331 the scissile bond is an amide and not an ester (this is only when a N-terminal group is available  
 332 to act as the general base).<sup>24</sup>

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337 **Figure 4.** Simulation of the de-acylation reaction with the N-terminal group of the P' fragment acting as  
 338 general base in charge of water activation. **(4a)** B3LYPD3/6-31+G\*/MM free energy profile along the path-  
 339 CV for the de-acylation reaction. The process takes place in two steps. In the first one the water activated  
 340 by the N-terminal group attacks the acyl-enzyme complex (ACE) to form a thiodiolate intermediate (I)  
 341 through the first TS (TS1). In the second one the reaction product (Pr) is obtained after breaking the acyl-  
 342 enzyme bond in the second TS (TS2). **(4b)** Evolution of the distances selected as collective variables along  
 343 the minimum free energy path.  $S_{\gamma}\text{-H}_{w2}$  in green,  $N_{\epsilon}\text{-N}(P1')$  in black,  $O_w\text{-C}(P1)$  in grey,  $N(P1')\text{-H}_{w1}$  in red,  $S_{\gamma}\text{-}$   
 344  $C(P1)$  in yellow,  $O_w\text{-H}_{w1}$  in purple and  $O_w\text{-H}_{w2}$  in blue. **(4c)** Representation of TS1 where the water molecule  
 345 is transferring a proton to the N-terminal group of the P' fragment and the resulting hydroxyl anion attacks  
 346 the carbonyl carbon atom of the P fragment (C(P)). The values of the distances correspond to the  
 347 coordinates of the MFEP at TS1. **(4d)** Representation of the thiodiolate intermediate (I). **(4e)** Representation  
 348 of TS2 corresponding to the breaking of the  $S_{\gamma}\text{-C}(P1)$  bond and the proton transfer from the carboxylic  
 349 terminal group to the leaving sulfur atom. **(4f)** Representation of the reaction products (Pr) with the P-COO-  
 350 and P'-NH<sub>3</sub><sup>+</sup> peptide fragments in the active site of the protease.

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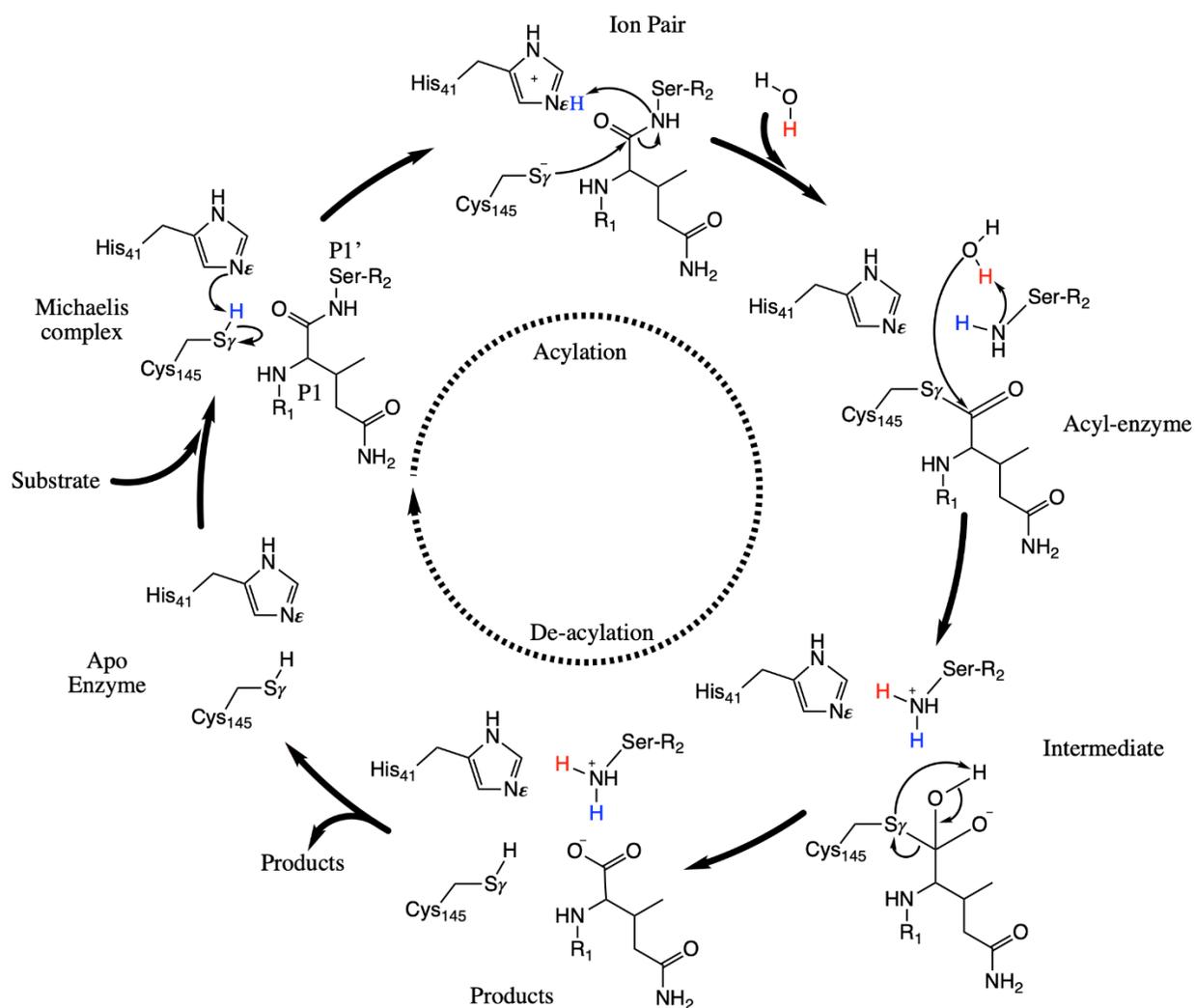
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## Conclusions

We have presented a detailed analysis of the Michaelis complex and the proteolysis mechanism in the 3CL<sup>pro</sup> of SARS-CoV-2 using DFT/MM computational simulations. Our study has identified key interactions established between the protein and a peptide substrate and the detailed reaction mechanism (see the complete reaction cycle in Figure 5). The reaction process involves the formation of a catalytic dyad ion pair from which the acylation step can be proceed (see Supplementary Video 1). In this acylation, the TS involves the proton transfer from His41 to the nitrogen atom followed by the nucleophilic displacement of the peptide bond by the S<sub>γ</sub> atom of Cys145. For the de-acylation step (Supplementary Video 2), we have proposed a novel mechanism where the N-terminal group of the firstly formed peptide fragment is the general base catalyzing the hydrolysis of the acyl-enzyme complex. This mechanistic proposal can explain some of the experimental differences observed between amide and ester substrates in the highly similar protease of SARS-CoV. Our simulations stress on the role of the interactions established by the P1' moiety during the binding and reaction processes, indicating that this group can play an important role, both from thermodynamic and kinetic perspectives, in the design of better inhibitors of the 3CL<sup>pro</sup> of SARS-CoV-2.

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390  
 391 **Figure 5.** Schematic representation of the proteolysis mechanism in 3CL<sup>pro</sup> of SARS-CoV-2 as deduced  
 392 from our simulations.  
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## 395 **Methods**

### 396 ***Classical Molecular Dynamics Simulations***

397

398 The crystal structures with PDB codes 6Y2F<sup>7</sup> and 3AW0<sup>30</sup> were used as starting points to build  
399 the Michaelis complex. The former corresponds to the holo protease of SARS-CoV-2, the latter  
400 is the crystallographic structure of the SARS-CoV ortholog co-crystalized with the peptidic  
401 aldehyde inhibitor Ac-Ser-Ala-Val-Leu-His-Aldehyde. To build the Michaelis complex  
402 corresponding to the 3CL<sup>pro</sup> protease of SARS-CoV-2 the two protein structures were aligned and  
403 then the co-crystalized ligand in 6Y2F was replaced with the crystallized ligand in 3AW0 in the  
404 two active sites of the homodimer (protomers A and B). The peptidomimetic Ac-Ser-Ala-Val-Leu-  
405 His-Aldehyde inhibitor was elongated using the Maestro tool<sup>31</sup> until we built the substrate like  
406 sequence Ac-Ser-Ala-Val-Leu-Gln-Ser-Gly-Phe-NMe in the two active sites. The absent  
407 hydrogens atom were added using the Protein Preparation Wizard tool of Maestro, and  
408 PROPKA3.0<sup>32</sup> was used to calculate the protonation states of titratable residues at pH 7.4.

409

410 The tleap tool from AmberTools18<sup>33</sup> was used to prepare the simulation systems. The Michaelis  
411 complexes, described with the ff14SB force field<sup>34</sup>, were solvated into a box with a buffer region  
412 of at least 12 Å from any protein/substrate atom to the limits of the simulation box. TIP3P water  
413 molecules<sup>35</sup> were used. Na<sup>+</sup> atoms were added to neutralize the charge. The resulting system  
414 was minimized using 500 steps of steepest descent method followed by the conjugate gradient  
415 method, until the root mean square of the gradient was below 10<sup>-3</sup> kcal mol<sup>-1</sup>Å<sup>-1</sup>. The system was  
416 then heated from 0 to 300 K using a heating rate of 1.7 K·ps<sup>-1</sup>. The backbone heavy atoms were  
417 restrained in a cartesian space using a harmonic potential with a force constant of 20 kcal mol<sup>-1</sup>Å<sup>-2</sup>.  
418 Along the equilibration step, the positional restraint force constant was changed from 15 to 3  
419 kcal mol<sup>-1</sup>Å<sup>-2</sup>, decreasing by 3 units every 1.25 ns, and after 6.25 ns the positional restraints were  
420 removed and the systems continued their equilibration until 7.5 ns of NPT (300 K and 1 bar)  
421 simulation was completed. Then, 8 μs of NVT simulation at 300 K was performed with a 2 fs time  
422 step using SHAKE<sup>36</sup>. The Particle Mesh Ewald method was employed to describe the long range  
423 electrostatic interactions,<sup>37,38</sup> for the short range interactions a cutoff of 10 Å was used. Pressure  
424 was controlled by the Berendsen barostat and the temperature by the Langevin thermostat. For  
425 all the simulations, periodic boundary conditions were employed. The AMBER19 GPU version of  
426 pmemd<sup>15,16</sup> was used to run the classical molecular dynamic simulations. In order to sample a

427 reasonable configurational space of the protein, two additional replicas of the Michaelis complex  
428 model with different initial velocities were run during 1  $\mu$ s.

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### 430 ***QM/MM Calculations***

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432 Exploration of the free energy surfaces associated to the peptide bond breaking process have  
433 been carried out using QM/MM simulations. In most simulations (see Table S1 for details), the  
434 side chains of the catalytic dyad (Cys145 and His41) and a fragment of the peptide substrate  
435 were included in the QM region while the rest of the system was described at the MM level as  
436 explained above. The part of the substrate described at the QM level includes the two residues  
437 involved in the peptide bond to be broken (Gln-P1 and Ser-P1') and the previous and next peptide  
438 bonds up to the C $^{\alpha}$  atoms of Leu-P2 and Gly-P2'. In the exploration of the hydrolysis of the acyl-  
439 enzyme we also included a water molecule in the QM region. To describe the QM subsystem we  
440 used the B3LYP functional<sup>39,40</sup> and D3 dispersion corrections<sup>41</sup>. Calculations were performed with  
441 the 6-31+G\* basis set, unless indicated (we also employed the 6-31G\* basis set). This level of  
442 theory has been shown to be one of the best combinations to describe enzymatic reactions<sup>42</sup>. In  
443 addition, this computational description for the QM region (B3LYPD3/6-31+G(d)) provides a gas  
444 phase enthalpic change for the proton transfer reaction between imidazole and methanethiol (the  
445 motifs of Cys and His side chains) in excellent agreement with the experimentally derived value  
446 (see Supplementary Methods). All calculations were run with a modified version of Amber18<sup>33,43</sup>  
447 coupled to Gaussian16<sup>44</sup> for Density Functional Theory calculations. A cutoff-radius of 15 Å was  
448 used for all QM-MM interactions and the temperature was 300 K.

449

450 In order to explore the free energy landscape associated to the chemical reaction we used our  
451 implementation of the string method, the Adaptive String Method (ASM).<sup>18</sup> In this method N  
452 replicas of the system (the nodes of the string) are evolved according to the averaged forces and  
453 kept equidistant, converging in such a way to the minimum free energy path (MFEP) in a space  
454 of arbitrary dimensionality defined by the collective variables (CVs). Once the string has  
455 converged, (see an example in Figure S5) we define a single path-CV (a collective variable called  
456 s) that measures the advance of the system along the MFEP. This path-CV is used as the reaction  
457 coordinate to trace the free energy profile associated to the chemical transformations under  
458 analysis. The MFEPs were explored on a free energy hypersurface defined by a set of CVs formed

459 by those distances showing relevant changes during the process under study: H-S $\gamma$ (Cys145), H-  
460 N $\epsilon$ (His41), H-N(P1'), S $\gamma$ (Cys145)-C(P1) and C(P1)-N(P1') for the acylation step (see Scheme 2a)  
461 and H<sub>w1</sub>-O<sub>w</sub>, H<sub>w1</sub>-N(P1'), O<sub>w</sub>-C(P1), S $\gamma$ (Cys145)-C(P1), H<sub>w2</sub>-O<sub>w</sub>, N(P1')-N $\epsilon$ (His41) and H<sub>w2</sub>-  
462 S $\gamma$ (Cys145) for the de-acylation step (see Scheme 2b). Different initial guesses, corresponding to  
463 different mechanistic proposals, were explored at the B3LYPD3/MM level using first the 6-31G\*  
464 basis set and then the best candidates were recalculated using the 6-31+G\* basis set. Each of  
465 the strings was composed of at least 96 nodes (see Supplementary Table S1), which were  
466 propagated with a time step of 1 fs until the RMSD of the string fell below 0.1 amu<sup>1/2</sup>·Å for at least  
467 2 ps. The converged MFEPs are then averaged to define the *s* path-CV corresponding to each  
468 string. The free energy profiles along the path CVs were obtained using an Umbrella Sampling  
469 algorithm<sup>45</sup>, running simulations for at least 10 ps and were integrated using WHAM technique<sup>46</sup>.  
470 The values of the force constants employed to bias the ASM simulations are determined on-the-  
471 fly to ensure a probability density distribution of the reaction coordinate as homogeneous as  
472 possible.<sup>18</sup> Replica exchange between neighbor string nodes was attempted every 50 steps to  
473 improve convergence.

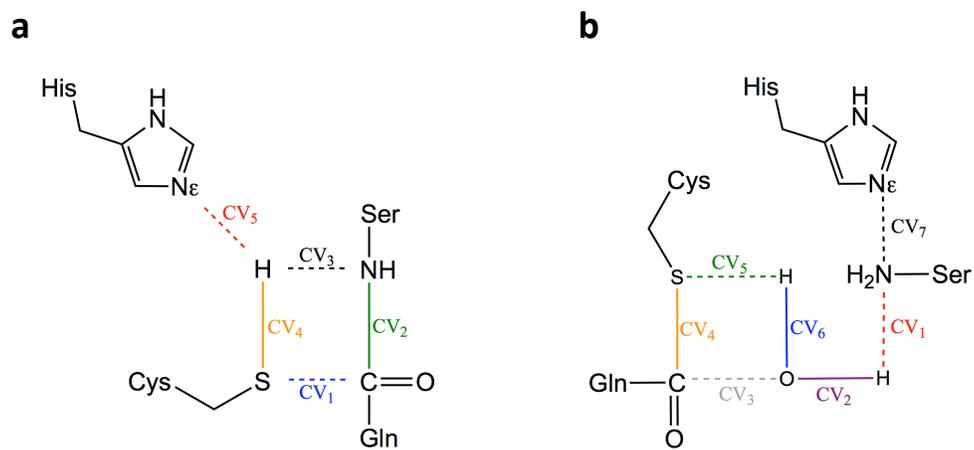
474  
475 For the proton transfer between Cys145 and His41, considering the proximity of the proton donor  
476 and acceptor atoms and the geometrical simplicity of the process, we traced the free energy  
477 profile using Umbrella Sampling<sup>45</sup> along a simple proton transfer coordinate defined as the  
478 antisymmetric combination of the distances of the proton to the donor and the acceptor atoms  
479 ( $d(\text{N}\epsilon\text{-H})-d(\text{S}\gamma\text{-H})$ ). For this profile only the side chains of the two involved residues were included  
480 in the QM region (using the B3LYPD3/6-31+G\* level of theory). A total of 40 windows were used,  
481 corresponding to an increment of the reaction coordinate of 0.06 Å, each of them composed of  
482 10 ps of equilibration and 20 ps of data collection. The force constant employed to drive the  
483 reaction coordinate change was of 600 kcal·mol<sup>-1</sup>·Å<sup>-2</sup>. All the rest of details of the simulations were  
484 as described before. We also used Umbrella Sampling along distinguished coordinates explore  
485 the free energy landscape associated to the separation between the first peptide fragment and  
486 the acyl-enzyme complex and between the two peptide fragments at the end of the de-acylation  
487 process. Details of all the free energy simulations performed in this work are given in  
488 Supplementary Table S1.

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**Scheme 2**

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