# **Mechanistic Insights into Nitrile and Alkyne Covalent Inhibitors of the SARS-CoV-2 Main Protease**

Ashim Nandi,<sup>1</sup> Mojgan Asadi,<sup>1,2</sup> Aoxuan Zhang,<sup>1</sup> Zhen T. Chu<sup>1</sup> and Arieh Warshel<sup>1,\*</sup>

<sup>1</sup>Department of Chemistry, University of Southern California, Los Angeles, California 90089-1062, United States

<sup>2</sup>Department of Chemistry, Stanford University, Stanford, California 94305-5012, United States

\*Correspondence[: warshel@usc.edu](mailto:warshel@usc.edu)

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#### **Abstract**

The treatment of SARS-CoV-2 can be accomplished by an effective suppression of its 3CL protease (3CL $P<sup>PO</sup>$ ), also known as the main protease (M $P<sup>PO</sup>$ ) and nonstructural protein 5 (nsp5). Covalent inhibitors can irreversibly and selectively disable the protease, particularly when they are highly exothermic. Herein we investigated the distinct kinetic behaviors exhibited by two covalently linked SARS-CoV-2 inhibitors. One of these inhibitors features a nitrile reactive group, while the other has this group replaced by an alkyne group, a less reactive electrophile. Our investigations involve the assessment of the free energy surfaces of the key feasible mechanisms that is direct and water-assisted involve in the rate-determining proton-transfer nucleophilic attack step through the utilization of both ab initio and empirical valence bond (EVB) simulations. The calculated free energy profiles show that substituting the nitrile group with alkyne increase the chemical barrier but leads to very exothermic reaction energy and is an irreversible process as opposed to nitrile, which is moderately exothermic and reversible. We also examine the timedependence of IC50 inhibition by applying a novel kinetic simulation approach, which is particularly important in studies of covalent inhibitors with a very exothermic bonding step. Our computational approach gave a good agreement between the calculated and observed values of the time dependance results for the nitrile and alkyne inhibitors.

#### **Introduction**

The coronavirus disease 2019 (COVID-19), caused by the severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2), has been one of the most devastating pandemics of recent times. There has been significant effort to develop antiviral therapeutics targeting two proteases of SARS-CoV-2: the main protease (M<sup>pro</sup>) and papain-like protease (PL<sup>pro</sup>).<sup>1–3</sup> Out of these targets, M<sup>pro</sup>, also known as 3-chymotrypsin-like protease (3CL<sup>pro</sup>), has received significant attention in the development of antivirals, i.e., protease inhibitors, to combat COVID-19, <sup>4</sup>–<sup>7</sup> with the fundamental aim to disrupt the function and life cycle of SARS-CoV-2. <sup>8</sup> Several small-molecule inhibitors of SARS-CoV-2 M<sup>pro</sup> have been discovered, with a few progressing into early-phase human clinical trials. 9,10 Covalent enzyme inhibitors are of significant interest as biochemical tools and therapeutic drugs.<sup>11</sup> Previous authors have summarized the distinctive advantages and disadvantages of covalent enzyme inhibition in drug and inhibitor design. 12–14 As the treatment of COVID-19 requires disabling the activity of M<sup>pro</sup>, covalent inhibitors with high exothermicity and irreversible binding to M<sup>pro</sup> can be important candidates for antiviral treatments. A notable therapeutic strategy for COVID-19 is to design inhibitors with an electrophilic reactive group ("warhead") that binds to the nucleophilic target cysteine 145 (Cys145) in Mpro. Cys145 is essential for the catalytic activity of M<sup>pro</sup>, so blockage or modification of this residue is detrimental to the virus.<sup>15-19</sup> Nirmatrelvir is a new FDA-approved medication developed for the treatment of COVID-19<sup>20</sup> that has a nitrile warhead and binds covalently and reversibly to Cys145. There are several known derivatives of nirmatrelvir<sup>21</sup>, some of which are reversible, while others lead to irreversible catalytic reactions.

Recently, Zhang and co-workers have demonstrated the effectiveness of latent electrophilic warheads,<sup>22</sup> such as terminal alkynes in inhibiting M<sup>pro</sup> compared to more reactive electrophiles like acrylamides. These terminal alkyne warheads demonstrate marked specificity for M<sup>pro</sup> due to their lack of intrinsic reactivity, which circumvents nonspecific binding to other cellular proteins. Upon activation within the active site of  $M<sub>pro</sub>$ , these warheads have shown potent inhibition, as confirmed through biochemical assays and structural analysis via X-ray crystallography. Notably, these terminal alkyne-based inhibitors have also exhibited promising antiviral activity in cellular models of COVID-19, indicating their potential as effective therapeutic agents. 23,24

Our prior computational investigations into covalent inhibitors targeting M<sup>pro</sup> explored the mechanism of  $\alpha$ -ketoamide inhibitors<sup>19</sup> and the estimation of their absolute binding free energies<sup>19</sup>. This study has been arguably the first calculation of the actual binding energetics of covalent inhibitor of Mpro. Our subsequent study introduced a more effective thermodynamic cycle for evaluating absolute binding energies.<sup>25</sup> The present study centers on a comparative analysis between nirmatrelvir and its alkyne-substituted counterpart, where the nitrile group is substituted with an alkyne group<sup>23,26</sup> (see Figure 1). It is important to note that previous QM/MM studies<sup>27–31</sup> have not focused on or thoroughly investigated the actual binding energetics of inhibitors targeting the SARS-CoV-2 Mpro .

Our objective is to elucidate the underlying factors behind the distinct behaviors exhibited by these inhibitors, particularly with regard to the time-dependent inhibition process. To achieve this goal, we conducted a comprehensive exploration of the reaction mechanisms associated with each inhibitor through ab initio and empirical valence bond (EVB) simulations. A prior experimental study<sup>22</sup> has shown that the alkyne derivative inhibits  $M<sup>pro</sup>$  approximately five times more effectively than nirmatrelvir, with an IC50 value of ~0.76  $\mu$ M for nirmatrelvir and IC50  $\geq$  0.063  $\mu$ M for the alkyne derivative, following a preincubation period of three hours.<sup>23,32</sup> Our simulations have not only substantiated the exothermic nature of the alkyne substitution but also replicated the corresponding time-dependent IC50 trend, corroborating the assertion that the alkyne derivative is a more potent inhibitor compared to nirmatrelvir.



**Figure 1.** Chemical structure of nirmatrelvir showing (a) nitrile and its (b) alkyne derivative warhead. The warhead is highlighted.

#### **Computational Methods**

#### **System Equilibration**

Our study began with the utilization of a co-crystal structure of the main protease (M<sup>pro</sup>) of SARS-CoV-2 and the drug nirmatrelvir. The specific structure employed was sourced from the Protein Data Bank (PDB), under the identifier 7RFS.<sup>32</sup> In this structure, nirmatrelvir is observed to be covalently bonded to the cysteine residue at position 145 (Cys145) of the protease. To investigate the effects of an alkyne derivative, we referenced a similar co-crystal structure wherein the derivative forms a covalent bond at the same cysteine residue, as detailed in the study by Zhang et al. (PDB 8FY6). <sup>22</sup> Following the selection of the initial structures, we performed molecular dynamics simulations using the GROMACS software suite (version 2021)<sup>33</sup> with 40 ns trajectories. The Amber force field (ff14sb) was employed to model the interactions within the system. Subsequently, we carefully selected suitable initial configurations from the simulation trajectories to serve as starting points for the subsequent calculations involving the empirical valence bond (EVB) method. In order to define the force field parameters for the ligand atoms, we referred to the generalized Amber force field (GAFF) using AmberTools 21. 34

#### *ab initio* **Calculations**

The reaction mechanisms pertinent to the aqueous phase, crucial for the calibration of EVB study (see below) were explored using ab initio computational methods. The study entailed modifying the inhibitor molecules under consideration by truncating their reactive groups and capping the resulting sites with a methane moiety, as depicted in Figures S1 and S2 in the Supplementary Information section. For the computational analysis, we employed the Gaussian 16 software package. <sup>35</sup> The quantum mechanical calculations were carried out using Density Functional Theory (DFT), specifically applying the B3LYP functional combined with the  $6-311+G(d,p)$  basis set.<sup>36</sup> The choice of this method is supported by recent studies<sup>27</sup> showing that B3LYP accurately describes the proton transfer and nucleophilic attack of a thiolate on a Michael acceptor. Additionally, in an *ab initio* benchmark study<sup>37</sup> on the proton transfer between CYS145 and HIS41 in SARS-CoV-2 Mpro, B3LYP demonstrated superior performance when benchmark against highlevel LCCSD(T) methods and experimental data. The GD3BJ correction was applied to account for dispersion interactions, and solvent effects were modeled using the SMD method.<sup>38</sup> Both the geometry optimizations and energy evaluation were conducted under this theoretical framework. The SCF convergence criteria were set by using the keyword "opt  $=$  tight", which sets the maximum and root-mean-square (RMS) forces to  $1.5 \times 10^{-5}$  and  $1.0 \times 10^{-5}$  hartree/bohr and the maximum and RMS displacements to  $6.0 \times 10^{-5}$  and  $4.0 \times 10^{-5}$  bohr. The "ultrafine" grid, which is a pruned direct product of a 99-point Euler−MacLaurin radial grid combined with a 590-point Lebedev angular grid was employed for all DFT calculations. Intrinsic reaction coordinate (IRC) calculations were conducted to confirm that the transition state smoothly connects to both the reactant and product sides.

#### **EVB Simulations**

The EVB methodology utilizes a hybrid quantum mechanics/molecular mechanics (QM/MM) framework to model chemical reactions through a combination of relevant diabatic states. This enables an efficient exploration of reaction processes,<sup>39,40</sup> as detailed in the Supplementary Information. Prior studies have validated the utility of EVB in analyzing protease inhibition thermodynamics. 19,41–44

Our EVB calculations were executed with the Q6 simulation software package.<sup>45</sup> Within these simulations, the active site of the reaction comprises the inhibitor's reactive groups, Cys145, His41, and a catalytic water molecule in nitrile and is designated as region 1. The remainder of the enzyme-solvent system was categorized as region 2. Electrostatic potential (ESP) charges for atoms in region 1 were derived from Gaussian 16 calculations, <sup>35</sup> which were then transformed into Restrained Electrostatic Potential (RESP) charges using the Antechamber tool from AmberTools 21.<sup>34</sup> The initial position of the sulfur in cysteine was used to set the center of the simulations sphere. The system was immersed in a water sphere with a diameter of  $25 \text{ Å}$ , where the water molecules were described by the TIP3P model<sup>46</sup> and subjected to the SCAAS boundary conditions,<sup>47</sup> where the long-range effects were treated by the local reaction field.<sup>48</sup>

The multi-stage optimization of each reaction step commenced with a local energy minimization, constraining all heavy atoms with a force constant of 20 kcal/ (mol  $\AA^2$ ), followed by a gradual relaxation of these restraints and a temperature increase from 5 to 300 K over 1 ns for system equilibration. Subsequent to this, free-energy perturbation/umbrella sampling  $(FEP/US)^{49}$ 

simulations were conducted on the equilibrated systems to obtain the free-energy profiles. Ab initio activation and reaction energy data from reference solution reactions were then employed to fine-tune the EVB Hamiltonian for each step of the reaction mechanism. For comprehensive sampling, we performed five umbrella sampling replicas, each comprising 100 frames with a 5 ps duration per frame to ensure statistical reliability and robustness of the results. Additionally, we also repeated FEP sampling using from protein structures from various equilibration times (200 ps to 2 ns) for concerted proton transfer-nucleophilic attack reactions and found no substantial change in the predicted free energies.

#### **PDLD/S-LRA**-**2000 method**

The non-covalent binding free energy of the inhibitor to M<sup>pro</sup> was calculated by the Protein Dipoles Langevin Dipoles method in its linear response approximation (PDLD/S-LRA-2000) using a sampling of 4 different configurations collected at every 20 ps of successive MD relaxation.<sup>50–53</sup> This method, implemented in the MOLARIS-XG package, <sup>54</sup> efficiently computes binding energies by constructing proper thermodynamic cycles, as detailed in our previous work. 55,56 The PDLD approach represents water molecules semi-macroscopically as Langevin dipoles. The energy is evaluated using the linear response approximation,<sup>55</sup> which averages the charged and uncharged states. The entire system is embedded within a 20  $\AA$  simulation sphere centered around the Nirmatrelvir inhibitor and surrounded by a bulk continuum. The electrostatic energy was scaled using a dielectric constant of  $\varepsilon = 4$  for the protein,<sup>57,58</sup> and the non-electrostatic term, which is not specific and may vary by system, was scaled by a factor of 0.75 and is detailed in Ref<sup>53</sup>.

#### **Time-dependent kinetic simulations**

In the case of very exothermic covalent inhibitors, the justification of the use of the standard kinetic assay equations is far from obvious. Thus we used a kinetic simulation to evaluate the time dependence of the competitive inhibition of M<sup>pro</sup> in the experimental assay conditions by solving the first-order system of equations as described in  $ref<sup>41</sup>$ , with the exception that the inhibitor may be reversible. That is, competitive inhibition is described by the scheme,

$$
\mathrm{E} + \mathrm{S} \underset{k_{-s}}{\overset{k_{s}}{\rightleftharpoons}} \mathrm{E} \cdot \mathrm{S} \xrightarrow{k_{s,\mathrm{cat}}} \mathrm{E} + \mathrm{P}
$$

$$
\mathrm{E} + \mathrm{I} \underset{k_{-1}}{\overset{k_{1}}{\rightleftharpoons}} \mathrm{E} \cdot \mathrm{I}^* \underset{k_{-2}}{\overset{k_{2}}{\rightleftharpoons}} \mathrm{EI}
$$

where E is the enzyme, S is the substrate, P is the product, I and I<sup>\*</sup> are the free and bound inhibitors, and EI is the covalently bound enzyme-inhibitor complex. The equilibrium constant  $K_i = k_{-s}/k_s$ , and catalytic rate  $k_{s,cat}$  of the substrate are determined by experimental characterization of the enzyme. The equilibrium dissociation constant  $K_i = k_{-1}/k_1$  is determined from the calculated PDLD/S-LRA-2000 binding affinity,<sup>51</sup>  $\Delta G_{bind}$  by  $K_i = e^{\Delta G_{bind}/k_b T}$ , while the rates  $k_2$  and  $k_{-2}$  are determined from the barrier and reverse barrier, respectively, in the EVB profile using the Arrhenius relation. As the second step of the inhibition scheme is the covalent and possibly irreversible step,  $k_2$  is equivalently denoted as  $k_{\text{inact}}$ .

#### **Results and Discussion**

The key residues of M<sup>pro</sup> include Cys145, His41, His163, His172, Glu166, and Ser144 (Figure 2) in its active site, which together form the oxyanion hole for the covalent and non-covalent binding interactions. The catalytic dyad Cys145-His41, in which the N $\epsilon$ 2 atom of His41 is 3.6Å away from the SG atom of Cys145, participates in the first proton transfer. We initially observed that the protonation state of His163 plays a crucial role in catalytic activity and binding affinity. One possible rationale is that the position of carbonyl oxygen in pyrrolidin-2-one of the inhibitors is stabilized by hydrogen bonding with His163. Thus, we proceeded with our calculations assuming N2 in His163 is protonated. We explored different ionizable states of His164 and His172 and overall, we found no significant changes in the EVB energy barrier when changing the protonated nitrogen from N $\epsilon$ 2 to N $\delta$ 1 or to both.



Figure 2. Structure of M<sup>pro</sup> covalently bound with the alkyne derivative of nirmatrelvir (PDB 8FY6). The alkyne warhead covalently bonded to the Cys145 after the proton-transfer nucleophilic attack (PT-NA) is circled. Surrounding key residues for binding and catalytic activity are also shown. The binding poses and the conformers of the catalytic residue are essentially identical to the structure of  $M<sup>pro</sup>$  covalently bound with nirmatrelvir (PDB 7RFS).

### *ab Initio* **Calculations**

As a starting point, we explored potential reaction pathways for the covalent binding of nitrile and alkyne functional groups to cysteine in a solution phase. These pathways will serve as reference reactions for our subsequent EVB calculations in water. We delineated each reaction pathway into two primary steps: a proton transfer between a cysteine and a histidine residue, and a concerted mechanism involving a proton transfer coupled with a nucleophilic attack (PT-NA), which can occur directly or with solvent assistance as discussed below.



**Figure 3.** Reaction mechanisms for nirmatrelvir displaying (a) direct and (b) water-assisted pathways involving nitrile  $(X = N)$ , and alkyne  $(X = CH)$  as warhead.

The reaction mechanism initiates by calculating the free energy of the first proton transfer (PT) process for both nirmatrelvir and its alkyne warhead. The PT between CYS145 and HIS41 for the reference solution reaction in the presence of inhibitor was taken from our previous work $59$  where we report a  $\Delta G_{\text{PT.obs}}$  of 7.0 kcal/mol in water. We assumed that the different warheads of the inhibitors studied here and in the Ref<sup>59</sup> have a similar impact on the PT process. Following the formation of the ion-pair intermediate during the PT process, we explored the proton transfernucleophilic attack (PT-NA) step using DFT calculations.

For the direct PT-NA mechanism involving the nitrile, our calculations show a relative free energy barrier ( $\Delta G^{\ddagger}$ ) of 22.4 kcal/mol and a reaction energy ( $\Delta G_0$ ) of -1.1 kcal/mol, indicating a slightly thermoneutral reaction. The free energy profile is displayed in Figure 4a. Additionally, a more accessible pathway is expected involving a water-assisted PT-NA, where water mediates the Htransfer from the nitrogen of histidine to oxygen. Our computational results show that the involvement of water lowers provides a similar barrier ( $\Delta G^{\ddagger}$  of 18.1 kcal/mol) compared to the direct pathway, however the reaction becomes more exothermic  $(\Delta G_0 = -5.0 \text{ kcal/mol})$ . In summary, the reaction of both pathways is kinetically feasible; however, it is more thermodynamically favored in the presence of water. Recent QM/MM studies on SARS-CoV-2

Mpro inhibition with nitrile derivatives also support that water-assisted PT-NA is the favorable path.<sup>28,60</sup> It is worth noting that previous QM/MM work<sup>28</sup> explored the direct PT-NA process but could not locate the TS, highlighting the challenges of this pathway. In our studied systems, we will explore both the direct and water-assisted PT-NA within the protein environment using EVB simulations (*vide infra*).

For the alkyne derivative, the free energy profile is shown in Figure 4b. In this case, the barrier for the water-assisted channel is found to be substantially lower by 13.4 kcal/mol compared to the direct path ( $\Delta G^{\ddagger}$  of 22.9 versus 36.3 kcal/mol). However, the reaction energy is slightly more exothermic in the direct path by 0.7 kcal/mol as compared to water-assisted  $(\Delta G_0)$  of -26.8 versus -27.5 kcal/mol). The overall free energy profile might appear to deviate from Hammond's postulate in the case of the alkyne, as well as for the same reaction in protein environment (*vide infra*), which states that more exothermic reactions should yield lower activation barriers. However, this postulate applies to elementary stepwise reactions, whereas our study involves a concerted pathway, so the kinetics can differ, as we have also reported in our earlier works involving concerted mechanism. 42,53



**Figure 4.** ab initio profile for the direct (in blue) and water-assisted PT-NA (in red) reaction mechanism of nirmatrelvir with (a) nitrile and (b) for the alkene derivative as warhead.

Additionally, we also explored alternate plausible mechanism involving the role of Asp187 in stabilizing the TS. This mechanism, however, was found to be very endothermic and thus inconsistent with the proposed Cys145-His41-Asp187 catalytic triad hypothesis.<sup>61</sup>

The calibration of the EVB simulations was determined by the above mechanistic explorations, as discussed in detailed below.

#### **EVB Calculations**

As detailed above, the ab initio calibrated EVB Hamiltonian for the reaction in solution provides the basis for modeling the corresponding enzymatic reactions. The calibrated EVB parameters as well as a summary of the reaction routes that were explored by EVB simulation are given in the Supporting Information. The free energy profile for the rate-determining state<sup>62</sup> in the studied mechanism i.e., the PT-NA step was evaluated in a reverse order using the EVB, starting from the available corresponding structures for the covalent form of the ligand. However, for the first PT process, we estimated  $\Delta G_{PT}$  using the PDLD/S-LRA-2000 method, applying the thermodynamic cycle shown in Fig. 5, similar to the strategy used in our previous work.<sup>25</sup> In this approach, we calculated the binding free energy of the ion-pair intermediate in the protein (see upper panel of Fig. 5) with CYS145, HIS41, and the inhibitor treated as the QM region. To the  $\Delta G_{QM}^P$  obtained from the upper panel, we added the  $\Delta G_{exp}^W$  from the reference solution reaction (lower panel), which is +7.0 kcal/mol, as mentioned above. This resulted in  $\Delta G_{PT}$  of 4.0 for the nitrile and 8.2 kcal/mol for the alkyne (see Table S1 in for SI for details).



**Figure 5.** Thermodynamic cycle for calculating the absolute binding free energy of the inhibitor before and after the proton transfer (PT) process.  $\alpha$  is the bond energy which is canceled out in the cycle.

Next, we turned our attention to the PT-NA step. Figure 6 present the EVB free energy profile for our reference solution reaction and in protein for nirmatrelvir (nitrile), comparing the direct (in blue) and water-assisted (in orange) mechanisms. Our calculations show that the rate-determining transition state (TS) is stabilized in the protein for both reaction mechanism giving  $\Delta G^{\ddagger}$  of 22.4 kcal/mol versus 16.9 kcal/mol when transitioning from water to protein for the direct mechanism, whereas, for the water-assisted path it is  $\Delta G^{\ddagger}$  of 18.1 kcal/mol versus 13.2 kcal/mol. This indicates that the water-assisted channel is the favorable pathway, this result is in agreement with other QM/MM studies,<sup>60</sup> which predicted a  $\Delta G^{\ddagger}$  of 16.3 kcal/mol for the water-assisted mechanism.

Regarding the reaction free energy, although our calculation shows that the nirmatrelvir (nitrile) overall reaction energy in both direct and water-assisted is slightly exothermic (see Figure 6). It is crucial to mentioned that the free energy profile presented in Figure 6 does not include the absolute

binding free energy of the non-covalent complex, which is crucial and have an significance influence on the reaction energies, which we studied using PDLD/S-LRA-2000 (*vide infra*).



**Figure 6.** EVB profiles for the reaction mechanism of nirmatrelvir (nitrile) in water and protein for the (a) direct and (b) water-assisted PT-NA path. The direct and water assisted mechanisms are depicted, respectively, on the left and right sides of the figure.

For the alkyne derivative, our calculations for the rate-determining state in the water-assisted pathway show a lower barrier than the direct (see Fig. 8) in protein, similar to the nitrile case. However, for the alkyne derivative, the water-assisted PT-NA free energy profile must account for the energetics of moving a water molecule from the bulk to a catalytic position, as there is no preexisting water molecule in this position in the crystal structure, unlike in the nitrile case. Usually, this energy is very small but here we examined this factor in view of the difference between the nitrile and alkyne. The examination should have been done in principle, by evaluating the PMF for water penetration by umbrella sampling or by our water flooding approach.<sup>63</sup> However, since we are dealing with a relatively small effect, we used a simplified alternative by evaluating the RDF for the nitrile and the alkyne, converting the RDF to PMF (which is presented on Figure 8) and then took the deference between the two PMFs as the energy of water penetration in the alkyne case. Since in the case of the nitrile we already have a water molecule in the catalytic position, by this procedure we estimate the water penetration penalty to be less than 1 kcal/mol.



Figure 7. Potential of mean force (PMF) of water penetration into the active site. The PMF is evaluated from the radial distribution function (RDF)  $g(r)$ , where r is the distance between the oxygen atom of a water molecule and the estimated position that enables a water-assisted PTNA, defined as the geometric center of the inhibitor's electrophile carbon, the inhibitor's carbonyl  $oxygen$ , and  $Ne2$  in histidine.

Incorporating this water penetration ( $\Delta G_{WP}$ ) energy, the overall EVB barriers for the direct and water-assisted pathways in the PT-NA are 28.3 kcal/mol and 22.4 kcal/mol, respectively, corresponding to slow inactivation rates  $k_{\text{inact}}$  of 1.6 x 10<sup>-8</sup> s<sup>-1</sup> and 1.5 x 10<sup>-3</sup> s<sup>-1</sup>. These results suggest that the direct mechanism is impossible to occur under normal experimental conditions, while the water-assisted pathway is the favorable route. Additionally, the reaction energies, excluding non-covalent inhibitor binding, are highly exothermic and irreversible for both mechanisms, with substantial reaction free energies of -34.3 kcal/mol for the direct pathway and - 20.6 kcal/mol for the water-assisted pathway.



**Figure 8.** EVB profiles for the reaction mechanism of the nirmatrelvir alkyne derivative for the (a) direct (b) water assisted mechanisms are depicted. The water-assisted PT-NA profile includes a water penetration (WP) contribution of 1 kcal/mol (described below).

As a final step, we investigated the crucial non-covalent binding process of the inhibitors and incorporated the non-covalent binding energy  $(\Delta G_{bind})$  into the EVB reaction profile. Our PDLD/S-LRA-2000 calculations yield  $\Delta G_{bind}$  values of -9.8 kcal/mol for the nitrile and -11.2 kcal/mol for the alkyne. Incorporating these values into the EVB profile for the protein, as shown in Figures 6 and 7, results in the complete free energy profile depicted in Figure 9.



**Figure 9.** Inclusion of the PDLD binding to the EVB profile for the direct and water-assisted reaction mechanisms of; (a) nitrile and (b) alkyne derivative in protein environment.

In both the direct and water-assisted mechanisms, it is observed that  $\Delta G_{\text{bind}}$  is an important intermediate that leads to a reduction in the overall reaction energies. After incorporating  $\Delta G_{\text{bind}}$ into the reaction profile, the reaction energy becomes -10.1 and -10.6 kcal/mol for the direct and water-assisted path. Other QM/MM studies have reported exothermicity values of -8.8 kcal/mol<sup>17</sup> and -9.5 kcal/mol<sup>60</sup> for the water-assisted mechanism, consistent with our results.

For the alkyne derivative, the overall reaction energies are -45.5 kcal/mol for the direct pathway and -32.8 kcal/mol for the water-assisted pathway. We do not have experimental data to validate our predictions. However, our calculated barriers of 22.4 kcal/mol for the kinetically feasible water-assisted path is in excellent agreement with similar alkyne derivative inhibitors of Cathepsin K studied in a recent QM/MM study.<sup>64</sup> This study reported a barrier of 20.1 kcal/mol for the direct mechanism, where the experimental barrier is 22.5 kcal/mol,<sup>65</sup> in excellent agreement with our water-assisted mechanism.

At this point, we would like to highlight the stark contrast between the EVB profile for the nitrile and alkyne. The lower activation barrier for the nitrile compared to the alkyne can be attributed to the better stabilization of the transition state due to its polar warhead during the PT-NA process. On the other hand, the low exothermicity of the nitrile and the high exothermicity of the alkyne (see Fig. 8) may be attributed to the fact that the alkene-based complex forms a more stable and stronger covalent bond than the imines after the PT-NA process. This trend in our reaction energy is consistent with other QM/MM studies on similar inhibitors. <sup>64</sup>

#### **Kinetics Simulation of Inhibitor Selectivity**

To address the task of linking the estimated and observed kinetics, we employed a simulation approach similar to the one we previously developed for studying the irreversible inhibition of tyrosine kinases.<sup>41</sup> Typically, IC50 and  $K_i$  are correlated in cases of reversible inhibitor binding. However, in this study, we are dealing with two distinct reactions: one is highly exothermic and irreversible, while the other is moderately exothermic and reversible. Consequently, it is essential

to use the calculated reaction free-energy profiles and kinetic simulations to replicate the experimental observable, specifically the time-dependent IC50(t). This should be done in conjunction with comparing the effective rate constant,  $k_{\text{eff}} = k_{\text{inact}}/K_i$ , as indicated by the binding energies and reaction rates.

We used a simple competitive inhibition scheme to generate the trend of the experimentally observed kinetics. The inhibition assay was simulated, subjecting the enzyme to pre-incubation with the inhibitor for a certain amount of time, and then calculating the initial velocity of product formation upon adding the substrate to the assay. We used the same initial conditions as the assay used by Zhang and co-workers<sup>22</sup> ( $[S]_0 = 20 \mu M$  and  $[E]_0 = 0.5 \mu M$ ) for both inhibitors. Additional simulation details and assay-dependent parameters are listed in the Supplementary Information. Table 1 lists the calculated kinetic and thermodynamic parameter along with simulated and experimental IC50 values for the direct and water-assisted mechanism. The simulated IC50 for the nitrile inhibitor does not change significantly between the two mechanisms, which is an indication of a reversible inhibition process. However, for the alkyne, the IC50 values change significantly with pre-incubation time. These results are consistent with experimental findings.<sup>22</sup>

**Table 1**: Summary of calculated energetics and simulated IC50 values for the water-assisted mechanism, compared with experimental IC50 values for the nitrile and alkyne derivative.<sup>22</sup> Energies are in kcal/mol while IC50 values are in μM.

<b>Inhibitor</b>	<b>Mechanism</b>	<b>EVB</b>		<b>PDLD</b>	<b>Simulated IC50</b>			<b>Experimental IC50</b>		
		$\Delta G^{\ddagger}$	$\Delta G_0$	$\Delta G_{\rm bind}$	30s	15min	3 <sub>h</sub>	0 <sub>h</sub>	15min	3 <sub>h</sub>
Nitrile	Direct	16.9	$-10.1$	$-9.8$	1.12	0.58	0.57	$0.34 \pm 0.11$	$0.56 + 0.32$	$0.76 \pm 0.27$
	Wat-assist.	13.2	$-10.6$		1.02	0.43	0.43			
Alkyne	Direct	28.3	$-45.5$	$-11.2$	15.28	0.94	0.28	$15.72 \pm 7.29$	$0.30 + 0.12$	$0.063 \pm 0.015$
	Wat-assist.	22.4	$-32.8$		15.28	0.94	0.27			

The simulated time-dependent IC50 curves for the direct and water-assisted mechanisms for the nitrile and alkyne derivatives are shown in Figures 9 and 10. The irreversibility of the reaction with the alkyne warhead is evident from the strong dependence of IC50 on pre-incubation time, in stark contrast to the nitrile case. The predicted IC50(t) of nirmatrelvir yield a value of 570 nM for the direct mechanism and 430 nM for the water-assisted pathway after 3 hours of pre-incubation. For the alkyne derivative, the IC50 is approximately 270 nM, indicating a two-fold greater potency, which agrees with the trend in the experimental assays reporting a ten-fold increase in potency.

While our simulated IC50 values (Table 1) are in close agreement with experimental data, they show little dependence on whether a direct or water-assisted mechanism is used for the nitrile warhead. However, for the alkyne derivative, the available experimental  $k_{eff}$  provides clear insight into which mechanism is favored. The experimental  $k_{eff}$  for the alkyne inhibitor is reported as  $5.3 \times 10^7$  M<sup>-1</sup>s<sup>-1</sup>, while our calculated  $k_{eff}$  from EVB and binding affinity simulations is 0.29 M<sup>-1</sup>s<sup>-1</sup> for the direct mechanism and  $2.3 \times 10^4$  M<sup>-1</sup>s<sup>-1</sup> for the water-assisted mechanism. The latter is in reasonable agreement with the observed value, further supporting our EVB results that the water-assisted mechanism is the favored pathway.



**Figure 9.** Simulated incubation assay of M<sup>pro</sup> under different preincubation times in varying concentrations of Nirmatrelvir, using the predicted EVB reaction kinetics of both (a) the direct and (b) water-assisted mechanism. The IC50 is obtained as the inhibitor concentration for which the velocity of product formation is cut by 50% (dashed line). Note, the green (15 min) curves overlap with the red (3 h) ones.



Figure 10. Simulated incubation assay of M<sup>pro</sup> under different preincubation times in varying concentrations alkyne derivative of Nirmatrelvir for the (a) direct and (b) water assisted. The irreversibility of the reaction with the alkyne warhead is apparent by strong dependence of the IC50 on pre-incubation time.

#### **Conclusions**

Our investigation explores the kinetics and thermodynamics of inhibition by two distinct inhibitors, each characterized by different reactive groups: one with a nitrile group and the other with an alkyne group. Using both EVB and PDLD/S-LRA-2000 simulations, we were able to delineate the binding energetics and chemical reactivity for both covalent and non-covalent interactions of these compounds. Our EVB calculations indicate that the water-assisted mechanism is more favorable than the direct mechanism for both inhibitors. The EVB barrier for the nitrile warhead agrees with other QM/MM studies, and while there is no reported activation barrier for the alkyne derivative in the studied system, our EVB barrier falls within the range of other covalent cysteine proteases. The reaction energy for the nitrile is moderately exothermic and reversible, matching other QM/MM studies. In contrast, the reaction energy for the alkyne derivative is highly exothermic and corresponds to an irreversible process, consistent with experimental findings.

Additionally, the insights gained from our kinetic modeling, listed in Table 1, is in close agreement with experimental data and reveal the superior efficacy of the alkyne-modified inhibitor compared to the nitrile over a three-hour period. Overall, this kinetic simulation approach, as demonstrated

for Mpro inhibitors, offers a rapid and valuable tool for identifying and assessing potential inhibitor compounds in pharmaceutical development.

# **Data Availability**

Optimized and transition state ab initio structures used for the EVB reference reactions are available at [https://github.com/AugustineZAX/covid\\_IC50/](https://github.com/AugustineZAX/covid_IC50/)

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