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# Understanding the binding of inhibitors of matrix metalloproteinases by molecular docking, quantum mechanical calculations, molecular dynamics simulations, and a MMGBSA/MMBappl study†

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Matrix metalloproteinases (MMPs) consist of a class of proteins required for normal tissue function. Their over expression is associated with many disease states and hence the interest in MMPs as drug targets. Almost all MMP inhibitors have been reported to fail in clinical trials due to lack of specificity. Zinc in the binding site of metalloproteinases performs essential biological functions and contributes to the binding affinity of inhibitors. The multiple possibilities for coordination geometry and the consequent charge on the zinc atom indicate that parameters developed are not directly transferable across different families of zinc metalloproteinases with different zinc coordination geometries, active sites and ligand architectures which makes it difficult to evaluate metal–ligand interactions. In order to assist in drug design endeavors for MMP targets, a computationally tractable pathway is presented, comprising docking of small molecule inhibitors against the target MMPs, derivation of quantum mechanical charges on the zinc ion in the active site and the amino acids coordinating with zinc including the inhibitor molecule, molecular dynamics simulations on the docked ligand–MMP complexes and evaluation of binding affinities of the ligand–MMP complexes via an accurate scoring function for zinc containing metalloprotein–ligand complexes. The above pathway was applied to study the interaction of inhibitor Batimastat with MMPs, which resulted in a high correlation between the predicted binding free energies and experiment, suggesting the potential applicability of the pathway. We then proceeded to formulate a few design principles which identify the key protein residues for generating molecules with high affinity and specificity against each of the MMPs.

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## Introduction

### MMPs as drug targets

Matrix metalloproteinases constitute a family of  $\text{Ca}^{2+}$  containing and  $\text{Zn}^{2+}$  dependent proteins. The family consists of more than 26 proteinases in mammals. Based on their substrate specificity, these are classified into collagenases (MMP-1, 8, 13 and 18), gelatinases (MMP-2, and 9), stromelysins (MMP-3, 10, 11, and 27), matrilysins (MMP-7 and 26) and membrane-type (MT-MMP)

and other enzymes.<sup>1</sup> The members contain a pre-domain involved in enzyme secretion and a catalytic domain for the activity of the enzyme. However, a C terminal domain in MMP-7, MMP-27 and MMP-23 is involved in substrate recognition. MMPs synthesized as inactive zymogens are activated through the cleavage of their pro-domains by other enzymes.<sup>1</sup> Their enzymatic activity is regulated by their natural inhibitors *viz.* tissue inhibitors of metalloproteinases (TIMPs).<sup>2,3</sup> Expression of these enzymes is responsible for several biological processes such as embryonic development, signal regulation, wound healing, angiogenesis, ovulation, uterine involution, bone resorption and nerve growth.<sup>4–8</sup> However a disturbance of this leads to over-expression of MMPs followed by accelerated matrix degradation mediating a number of pathological processes by changing the structures of a large number of substrates. The imbalance leads to several pathologies including cancer, loss of cartilage in osteoarthritis, rheumatoid arthritis, cardiovascular diseases, acute lung injury, periodontitis and many others.<sup>9–15</sup> The over expression of MMP-1, MMP-2, MMP-3, MMP-8, MMP-9, MMP-13 has been implicated in various

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diseases like breast cancer,<sup>16</sup> gastric cancer,<sup>17</sup> peripheral nerve injury,<sup>18–23</sup> neuropathic pain,<sup>23</sup> spinal cord injury,<sup>24–26</sup> brain injury,<sup>27–29</sup> colorectal cancer,<sup>30</sup> pathologic bone resorption,<sup>31</sup> chronic wound,<sup>32</sup> inflammation of the skin,<sup>33</sup> inflammation of the pulmonary tract,<sup>34</sup> hypersensitivity,<sup>35</sup> Alzheimer's disease,<sup>36,37</sup> Crohn's disease,<sup>37</sup> periodontitis.<sup>38</sup> As a result, MMPs have become drug targets of prime interest for finding effective inhibitors. The number of available high resolution X-ray crystal structures of MMP-inhibitor complexes has increased dramatically in recent years helping in the design of potential inhibitors at an early lead generation stage.<sup>39</sup> Molecules exhibiting high affinity toward Zn<sup>2+</sup> effectively would prevent the binding of the polypeptide to MMPs and thus are considered to act as MMP inhibitors.<sup>40</sup> Several Zn<sup>2+</sup>-binding groups (ZBGs) have been reported: the hydroxamates, reverse hydroxamates, carboxylates, hydroxyureas, hydrazides, phosphinates, sulfones, and sulfonylhydrazides of which the hydroxamates appear to be the most potent ones among them.<sup>1</sup> Many broad spectrum ZBG-containing small molecule inhibitors from different pharmaceutical companies have also entered clinical trials for cancer, rheumatoid arthritis, and osteoarthritis.<sup>41,42</sup> These broad-spectrum MMP inhibitors include hydroxamate-based Marimastat, Batimastat, Ilomastat, Prinomastat, Solimastat, Tanomastat, MMI-270, Trocade, Periomastat and Metamastat. Nearly all of these MMP inhibitors have failed in clinical trials due to lack of specificity against a given class of MMPs<sup>1</sup> posing a challenge to rational drug design of specific MMP inhibitors. Zinc is commonly found to be four-coordinated with a tetrahedral geometry; five and six coordinated geometries are also observed in zinc metalloproteinases, playing an important role in metal-ligand binding.<sup>41</sup> The geometries of zinc in different protein-ligand complexes have been illustrated previously.<sup>43</sup> Computational docking and prediction of binding affinities of metalloproteinase inhibitors to MMPs remains a challenge due to the multiple coordination geometries of zinc and lack of appropriate force field parameters to model the metal-ligand interactions.<sup>44</sup> Addressing these challenges, we combine in the current study, molecular docking, quantum mechanical charge derivation of the Zn atom in the binding site followed by molecular dynamics simulations on MMP-inhibitor complexes, and a *post facto* analysis of the MD trajectories to evaluate the binding free energies associated with MMP-inhibitor complexation. The ability to effectively predict the binding modes and affinities of small molecule inhibitors<sup>45</sup> of these zinc containing enzymes computationally can be of utmost importance in designing very selective clinically relevant inhibitors. Our study has resulted in the identification of key residues in different MMPs and formulation of a few design principles and further a set of new molecules with high affinity and specificity for each of the MMPs. These are described below.

## Methodology

Batimastat is a broad spectrum MMP inhibitor reported to have IC<sub>50</sub> values (in nM) of 10, 4, 20, 10, 1 and 3 against MMP-1, MMP-2, MMP-3, MMP-8, MMP-9, and MMP-13 respectively.<sup>1</sup> A docking and scoring study of *Batimastat* against these classes

of MMPs was performed. A flowchart describing the computational pathway followed for a systematic analysis of the binding of MMP inhibitors to the target protein in the current study is shown in Fig. 1.

### Docking the inhibitor in the target protein

The three-dimensional structures of MMPs were adapted from RCSB with PDB ids 2TCL, 1HOV, 1BIW, 1MNC, 1GKC, 456C corresponding to MMP-1, MMP-2, MMP-3, MMP-8, MMP-9 and MMP-13 respectively.<sup>2</sup> The zinc ion occurs in 4 or 5 coordinate geometry with the protein and the ligand atoms which are lying within a distance of 1.8 Å to 2.7 Å. A vast majority of MMP inhibitors chelate the catalytic zinc ion either in monodentate or bidentate fashion. These inhibitors replace the water molecule and coordinately bind to the zinc. Thus, the crystallographic water was removed from the protein<sup>42,46–48</sup> before performing the docking studies. Hydrogens were added<sup>49</sup> and the correct force field parameters were assigned to the protein.<sup>43</sup> The protonation states of the histidine residue were adjusted according to the hydrogen bond network.<sup>50</sup> The basic amino acids were protonated and the carboxylic groups were kept deprotonated. The coordinates of the Batimastat-MMP complexes are not reported. The inhibitor molecule Batimastat was modeled<sup>1</sup> maintaining the ionization states mentioned in the literature. The overall formal charge<sup>42</sup> on the Batimastat was  $-1$ . The molecule was then geometry optimized through the AM1 procedure followed by calculation of partial charges of the ligand by the AM1-BCC procedure.<sup>51</sup> GAFF force field parameters<sup>52</sup> were used to assign atom types, bond angles, dihedral and van der Waals parameters<sup>53</sup> to the inhibitor molecule. The target protein-ligand complex and the inhibitor molecule were given as input to *Sanjeevini*<sup>54</sup> software suite for docking and scoring studies. *Sanjeevini* is a freely accessible web server for protein and DNA targeted lead molecule discovery. The web server builds in several features including detection of the binding site in the target protein, scanning against a library of million compounds to identify hit molecules against a target protein, all atom based docking and scoring module and various other utilities to design molecules with desired affinity and specificity. The docking and scoring module of *Sanjeevini* has been previously validated on a large dataset of 335 protein-DNA drug targets for inhibitors with known crystal structures and known experimental binding free energies.<sup>54</sup> The protein targets consist of zinc containing metallo proteinases as well. The predicted binding free energy of the top ranked docked structures given as an output when compared with the experimental binding free energies gave a correlation coefficient  $r$  of 0.83. The root mean square deviation of the top ranked docked structure against the crystal structure was within 2 Å with 90% accuracy. The docking and scoring module of *Sanjeevini* was validated on matrix metalloproteinases with known inhibitors. A correlation coefficient  $r$  of 0.82 and  $R^2 = 0.68$  was obtained between experimental and predicted binding free energies of the top ranked docked structure as shown in Fig. 2. The predicted binding free energies along with the RMSDs of the



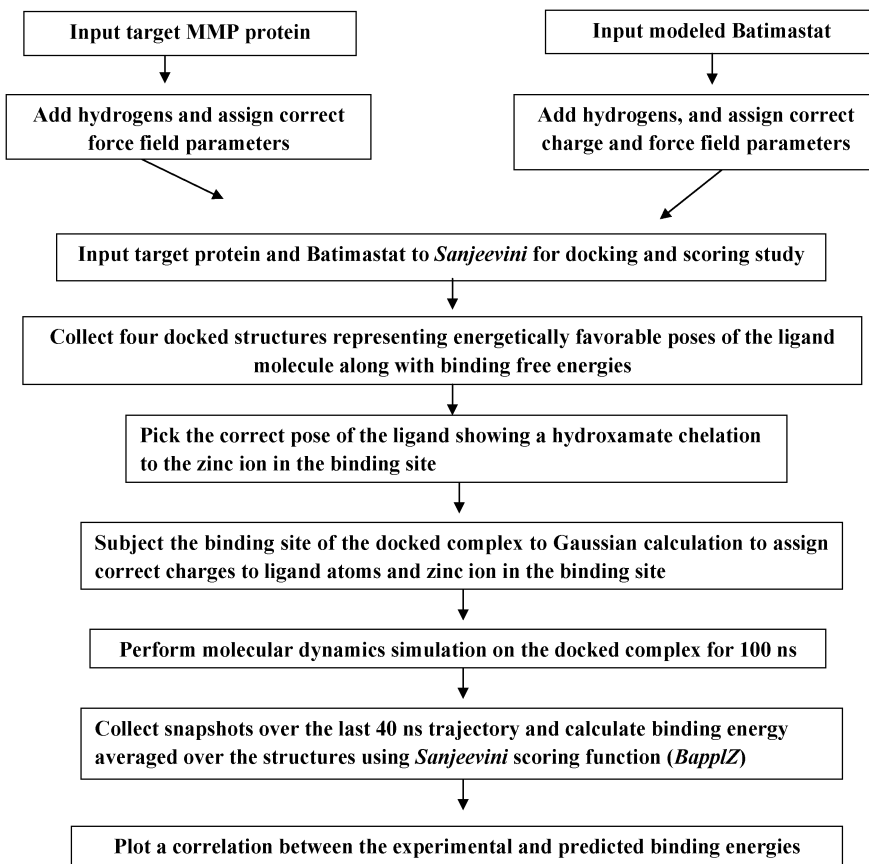


Fig. 1 A flowchart showing the steps followed in the docking and scoring study of Batimastat binding to different MMPs.

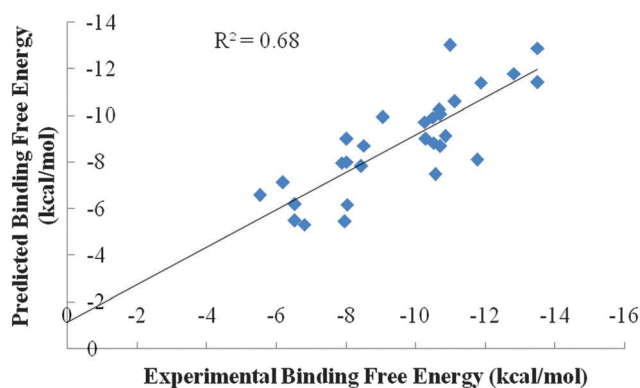


Fig. 2 Correlation between experimental binding free energies and predicted binding free energies (in kcal mol<sup>-1</sup>) for the binding of known MMP inhibitors.

top ranked docked structure against the crystal structure are given in Table S1 (ESI<sup>†</sup>).

The docking module of *Sanjeevini*<sup>55,56</sup> docks the ligand molecule in the binding site and generates several ( $\sim 10^3$ ) configurations *via* a six-dimensional rigid body Monte Carlo methodology resulting in many ligand configurations which are scored based on the scoring function in-built in *Sanjeevini*.<sup>43,57–59</sup>

#### Derivation of partial atomic charges on the docked ligand and the zinc ion, and the protein atoms

In the zinc containing metalloproteinases the ligand molecule is bonded with one or two co-ordinate bonds with the zinc ion due to which the total formal charge on the zinc is always less than +2 due to the charge transfer occurring between the amino acids and the ligand molecule coordinately bonded to the zinc ion. An accurate modelling of a large biomolecular system by the quantum mechanical method is computationally very expensive. However, quantum mechanical calculations on a small part of the system (active site of a protein) are affordable which could lead to insufficient descriptions. The semiempirical methods have successfully handled thousands of atoms but are not accurate in modelling systems with transition metals. The hybrid QM/MM method pioneered by Warshel and Levitt<sup>60</sup> is successful in providing solutions for the complex systems. The ONIOM (Own N layer Integrated molecular Orbital molecular mechanics) method is successfully applied to metalloenzymes. In a similar approach, where for the smaller region that is on the zinc binding moiety comprising the protein residues within the coordinate bond distance ( $\leq 2.7$  Å) of the zinc ion, the ligand and the zinc ion were subjected to HF/6-31G\* *ab initio* calculations through Gaussian software<sup>61</sup> suite followed by RESP fitting on the resultant electrostatic potentials to obtain partial atomic charges on the ligand and the zinc ion.



For the calculations, the protein residues within the coordinate bond distance were deprotonated and the net charge on the zinc binding motif was calculated which was a sum of the formal charge on each amino acid residue, formal charge on the ligand and +2 charge on the zinc ion.<sup>43</sup> van der Waals parameters for the zinc ion were adapted from the work of Stote and Karplus<sup>62</sup> [ $\sigma = 1.95 \text{ \AA}$  and  $\epsilon = 0.25 \text{ kcal}$ ] together with GAFF force field parameters for the ligand molecule.<sup>51</sup> The *AntechAMBER*<sup>49</sup> module of AMBER was used to assign the bonded and the nonbonded parameters to the ligand atoms. The protein atoms were assigned RESP derived partial atomic charges, van der Waals and bonded parameters using the AMBER force field.<sup>43</sup> The charges on the docked-MMP complexes are available at the following link <http://scfbio-iitd.res.in/sanjeevini/MMP.jsp>.

### Accounting for protein and ligand flexibility through molecular dynamics simulations

The protein-inhibitor complexes were subjected to molecular dynamics simulations to factor in the flexibility/dynamics of the ligand and the active site residues of the target along with explicit solvent and salt effects.<sup>63</sup> Simulations were carried out with periodic boundary conditions using AMBER suite of programs.<sup>49</sup> 11  $\text{Na}^+$  ions were added to MMP-2 and MMP-3 inhibitor complexes, 12  $\text{Na}^+$  ions to MMP-1, MMP-8, and MMP-9 inhibitor complexes and 7  $\text{Na}^+$  ions to the MMP-13 inhibitor complex to ensure electroneutrality of the protein-ligand complex being simulated. The complex was then solvated with a layer of water 8  $\text{\AA}$  thick. Water was modeled using the TIP4PEW parameters.<sup>64</sup> To maintain the orientation of the zinc-chelating histidine residues and to prevent the escape of the zinc atoms into the solvent, a restraint was applied on the distances defined by zinc and the nitrogen atoms of the histidine residue. After the initial preparation of the docked complexes the solvent was subjected to an initial minimization followed by the minimization of the solute-solvent system. A slow heating to 300 K was performed at constant volume over a period of 100 ps using harmonic restraints of  $25 \text{ kcal mol}^{-1} \text{ \AA}^{-2}$  on the solute atoms. These restraints were then slowly relaxed from 5 to  $1 \text{ kcal mol}^{-1} \text{ \AA}^{-2}$  in five segments of 1000 steps of energy minimization and 50 ps of equilibration with a constant temperature of 300 K and a pressure of 1 bar *via* the Berendsen algorithm<sup>65</sup> with a coupling constant of 0.2 ps for both parameters. Finally a 50 ps equilibration with a restraint of  $0.5 \text{ kcal mol}^{-1} \text{ \AA}^{-2}$  and a 50 ps of unrestrained equilibration was performed. Molecular dynamics simulation was then carried out for 100 ns at constant temperature and pressure conditions using Berendsen algorithm with a coupling constant of 5 ps. In all, six molecular dynamics simulation<sup>66</sup> runs were performed corresponding to the binding of Batimastat with MMP-1, MMP-2, MMP-3, MMP-8, MMP-9, and MMP-13. RMSD *versus* time plots were monitored for all the simulation runs to ensure the stability of the docked complexes.

### Post molecular dynamics simulation preparation of the docked complexes

At the end of molecular dynamics simulations, 100 structures were obtained from each of the six trajectories at equal intervals

from the last 40 ns trajectory file and prepared for binding free energy estimates of the protein-ligand complexes using *Bappl-Z*<sup>43</sup> scoring function. The approach is parameterized within the additivity approximation where the net free energy change is treated as a sum of a comprehensive set of individual energy-component contributions. The components are estimated in a force field compatible manner. The equation for the estimation of free energy change upon binding is:

$$\Delta G^\circ = \alpha E_{\text{el}} + \beta E_{\text{vdW}} + \sum_{A=1}^{22} \sigma_A \Delta A_{\text{LSA}} + \lambda(\Delta S_{\text{CR}}) + \delta \quad (1)$$

This methodology overcomes the limitations inherent in single point calculations (studies on energy minimized structures) by subjecting the systems to configurational averaging *via* molecular dynamic simulations. The above *BapplZ* scoring function validated thoroughly the earlier<sup>43</sup> captures of the theoretical rigor of MMGBSA/MMPBSA<sup>67–71</sup> methodology as well as rapidity of empirical/knowledge based methods.<sup>43,72,73</sup> Each component in eqn (1) is described below.

$E_{\text{el}}$  electrostatic term includes interactions between protein with the ligand atoms and the zinc ion with the rest of the complex. The interactions are calculated from Coulomb's law with a sigmoidal dielectric function for solvent screening to incorporate the desolvation electrostatics implicitly.<sup>43,57,72</sup> A non-bonded model from the work of Stote and Karplus<sup>62</sup> has been adopted to model the electrostatics interactions of zinc with the rest of the complex.

$E_{\text{vdW}}$  van der Waals term includes direct van der Waals between protein with ligand atoms and the zinc ion with the rest of the complex. The interactions were modeled using a (12,6) Lennard-Jones potential.<sup>43</sup> Again the work of Stote and Karplus was adopted to model the van der Waals interactions for the zinc ion.

$\sigma_A \Delta A_{\text{LSA}}$  hydrophobic component captures mainly the non electrostatic component of desolvation using the modified version of the Eisenberg-McLachlan model where the atom types in the AMBER force field for proteins and small molecules have been combined into a set of 22 atom types<sup>43</sup> to ensure transferability of parameters to other biomolecular systems.  $\Delta A_{\text{LSA}}$  in the above eqn (1) represents the net loss in surface area for an atom type.

The  $\Delta S_{\text{CR}}$  term represents the loss in conformational entropy of protein side chains upon the binding of ligand to the protein.<sup>43</sup>

Computational details of the above work have been explained earlier.<sup>43</sup> The  $\Delta G^\circ$  from the above equation is calculated for the single point system representing each snapshot of the structures obtained over the last 40 ns trajectory file and a block averaging is done to obtain the average binding free energy values.

## Results and discussion

In the zinc containing metalloprotein-ligand complexes, the ligand is coordinately bonded to the zinc ion with one or two coordinate bonds. *Sanjeevini* gives as output four docked structures representing energetically favorable poses of the ligand molecule in the binding site, out of their several configurations based on energy ranking defined by the scoring function. From the four poses, the pose of the ligand molecule in which the





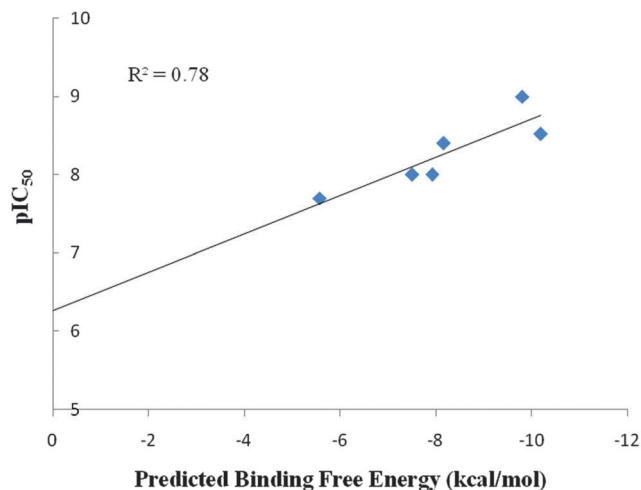


Fig. 3 Correlation between experimental pIC<sub>50</sub> and predicted binding free energies (in kcal mol<sup>-1</sup>) for the binding of Batimastat with MMP-1, MMP-2, MMP-3, MMP-8, MMP-9, MMP-13.

hydroxamate group showed a chelation to the zinc ion was collected. The RMSD vs. time plots shown in Fig. S1 to S6 (ESI<sup>†</sup>) attest to the stability of the docked complexes. Further, structures obtained from each of the molecular dynamics trajectories were processed through *BapplZ* scoring function and the average binding energies were calculated for Batimastat binding to different MMPs. Fig. S7 to S12 (ESI<sup>†</sup>) show the convergence of the binding energy values. We further plotted a correlation between the experimental and predicted binding free energies for Batimastat binding to different MMPs (Fig. 3). An efficient docking algorithm, a correct charge assignment protocol, a rigorous molecular dynamics simulation study and an accurate scoring function contribute to structural, dynamic and thermodynamic rationalization of experimental inhibition data, as evident from a high correlation coefficient between the experimental and predicted binding free energies shown in Fig. 3, thus demonstrating the efficiency of the computational pathway followed. The molecular dynamics simulation studies incorporated the structural and dynamic effects of the ligand which cannot be disclosed by docking studies alone.

For Batimastat the inhibitor was considerably less specific against any MMP. One of the major reasons for the lack of efficacy of MMP inhibitors is due to the reason that they are broad spectrum. Design of specific MMP inhibitors is thus interesting and challenging. In MMPs, in addition to the catalytic site, there are other sites designated as S1, S2, S3 and S1', S2' S3', shown<sup>1</sup> in Fig. 4, along with the catalytic region. The main site for substrate recognition is the specificity pocket S1' as the site differs in shape and size among different MMPs. Moreover, due to flexibility of the MMP binding pockets<sup>74–78</sup> predicting the binding free energies *in silico* has been difficult. Though structural information from the X-ray structures can be used to design inhibitors with high affinity and selectivity towards a given MMP, the flexibility of the MMP binding pockets limits an accurate estimation of binding free energies against a given MMP.

With the above concerns in focus, we further extended our study to the design of specific inhibitors against diverse MMPs

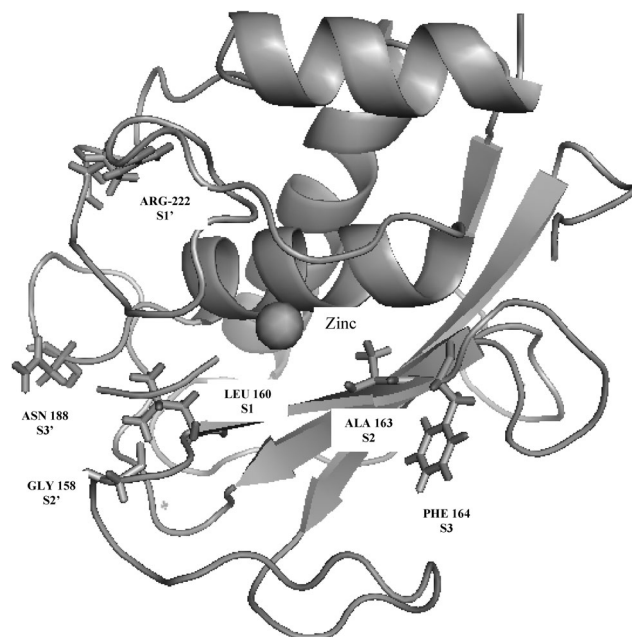


Fig. 4 S1, S2, S3 and the S1', S2', S3' sites in matrix metalloproteinases (pdb id: 2OY2).

dealt with above. A sequence alignment was performed on the MMPs using *Clustal W* program.<sup>79</sup> The specificity loop regions of different MMPs are shown in Fig. 5. While designing inhibitor molecules, amino acids showing a variation in the specificity loop region need to be considered to take care of the specificity issue.

### Some design principles for MMP inhibitors

We designed a few specific molecules against different MMPs with a special focus on MMP-2, MMP-3, MMP-8, MMP-9 and MMP-13 whose over expression is associated with various diseases. The molecules were designed with the main goal to fit in the S1' groove adjacent to the catalytic site of the MMPs to come up with specific hit molecules. The docked structures were subjected to molecular dynamics simulations using the protocol detailed in the methodology section for 10 ns to consider the flexibility/dynamics of the ligand and the active site residues of the target along with the explicit solvent, salt effects and also to account for the induced fit effects. After running the simulations, the docked structures obtained during the last four ns simulation runs were subjected to *BapplZ* calculation<sup>43</sup> and an average binding free energy was calculated. To check on the affinity *versus* specificity of the molecules designed against each class of MMP, a cross docking study was also performed. Table 1 shows the potential ligands obtained against different MMPs and an affinity *versus* specificity matrix for the molecules designed.

The scaffolds of the molecules designed are shown in Fig. 6–10 against MMP-2, MMP-3, MMP-8, MMP9 and MMP-13 respectively. The nomenclature to the designed molecules was given as per the MMP target for which it was designed. Molecule 2, molecule 3, molecule 8, molecule 9 and molecule 13 correspond to MMP-2, MMP-3, MMP-8, MMP-9 and MMP-13, respectively.



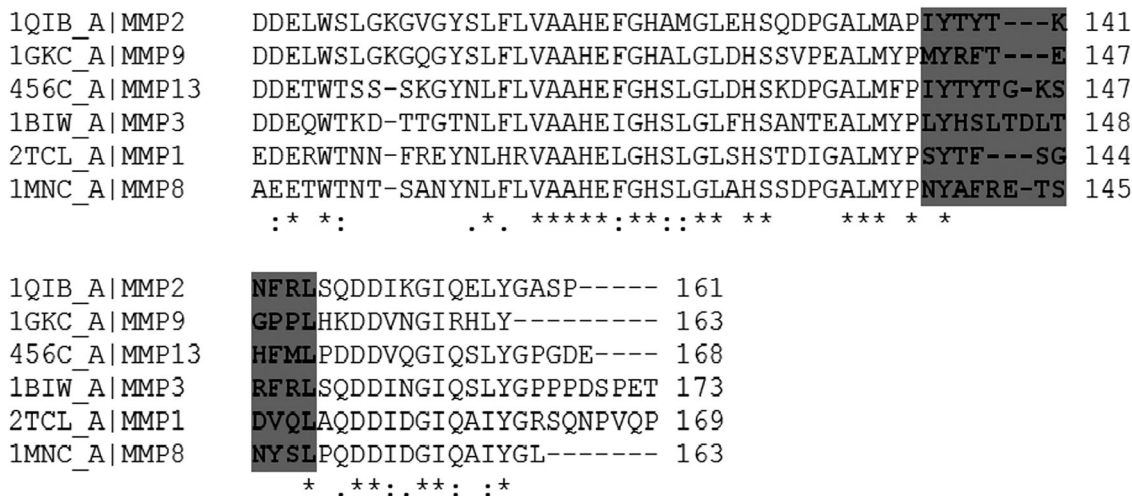


Fig. 5 Sequence alignment of MMPs. The highlighted region shows the amino acids lying in the specificity loop region.

Table 1 Affinity versus specificity matrix of the designed molecules (the binding energies predicted by *Sanjeevini* web server are reported in kcal mol<sup>-1</sup>)

	Molecule				
MMP	Molecule 2	Molecule 3	Molecule 8	Molecule 9	Molecule 13
MMP1	-2.05	-10.93	-3.44	-9.52	-10.92
MMP2	-10.67	-7.09	-0.68	-8.18	-9.748
MMP3	-7.09	-16.64	-9.5	-12.94	-9.84
MMP8	-6.25	0.82	-10.45	-12.09	-10.42
MMP9	-7.89	-9.64	-1.15	-15.55	-8.71
MMP13	-1.21	-11.26	-1.07	-8.12	-15.09

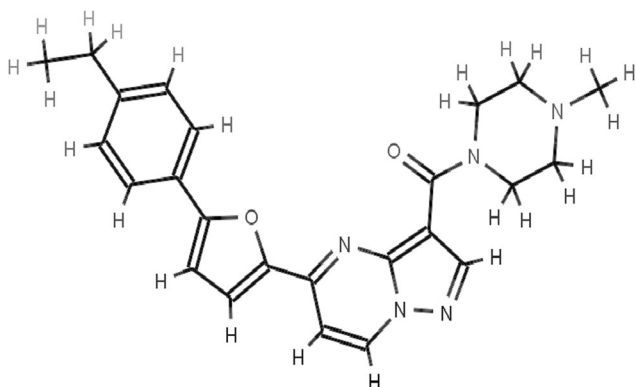


Fig. 6 Scaffold of molecule 2 designed against MMP-2.

There is considerable variation in the amino acids defining the shape and size of the S1' site. The MMP-1 has a shallow S1' pocket, MMP-2, MMP-8 and MMP-9 have intermediate depths and the MMP-3 and MMP-13 have deep S1' pockets as can be seen in Fig. S13–S17 (ESI<sup>†</sup>). In MMP-1, Arg 114 at the start of the catalytic helix makes the S1' site very shallow, providing scope for designing molecules specific for other MMPs and not against MMP-1, as they are reported to be involved in musculo-skeletal pains on getting inhibited by broad spectrum MMP inhibitors.<sup>43</sup> The *RASPD* module of *Sanjeevini*<sup>54</sup> was used to obtain the initial hit molecules against the target MMPs from a

million molecule database of small organic molecules (public version of zinc database<sup>80</sup>). The module sets up a QSAR type equation to find complementarity between the physico-chemical properties of the binding site of the protein and the candidate ligand molecule to estimate a binding energy between them. The molecule with ZINCID 20601870 (IUPAC name: 5-(2-furyl)-N-[1-[2-(1-piperidyl)ethyl]benzimidazol-2-yl]-7-(trifluoromethyl)pyrazolo[1,5-*a*]pyrimidi) was obtained as the top hit for all the MMPs as the binding site of the MMPs are very homologous to each other. Our attention was engaged by the presence of the carbonyl group which can show potential interaction with the zinc and the aromatic groups with suitable curvatures to show interactions with the S1' site. However, since the S1' site varies in the amino acid sequence and overall architecture, the starting scaffold of the molecule was modified through a structure based design approach targeting the S1' site along with the catalytic/binding site to bring in affinity as well as specificity of the molecules designed for each class of MMPs.

Thus, the main focus while designing the inhibitors for the respective MMPs was to optimize the length of the molecule designed according to the differences in the depth of the S1' pocket for different MMP subtypes. The fragment of the molecule penetrating the S1' site is referred to as the P1' fragment.<sup>1</sup> An inhibitor molecule that can show a chelation with the catalytic zinc ion and protrude into the S1' site of MMP-2, which is lined by the hydrophobic side chains<sup>81</sup> of Leu-83, Phe-115, Leu-116, Val-117, Ile-141 and Phe-148, was designed. We focused on designing an expected fragment targeting the S1' site, which was elongated and had a hydrophobic group along with a zinc chelating group. The inhibitor molecule 2, designed for MMP-2 fitted well in the S1' hydrophobic pocket facilitated by the long hydrophobic chains and showed electrostatic interaction with the zinc ion facilitated by the oxygen atom as shown in Fig. S13 (ESI<sup>†</sup>). During the molecular dynamics run on the MMP-2 inhibitor docked complex, conformational changes occurred suggesting the aromatic ring of Phe-148 moving towards the inhibitor molecule to make interactions and the Arg-149 rotating



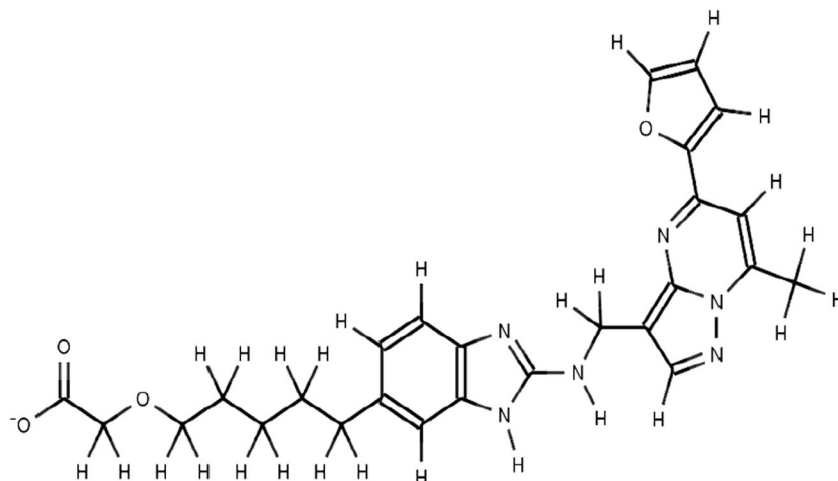


Fig. 7 Scaffold of molecule 3 designed against MMP-3.

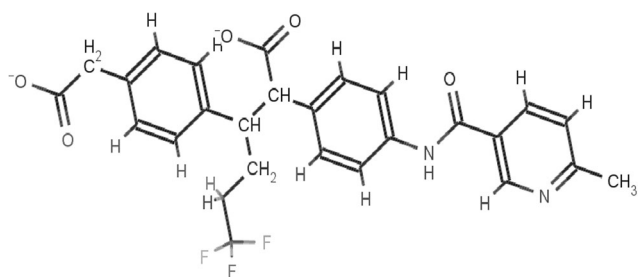


Fig. 8 Scaffold of molecule 8 designed against MMP-8.

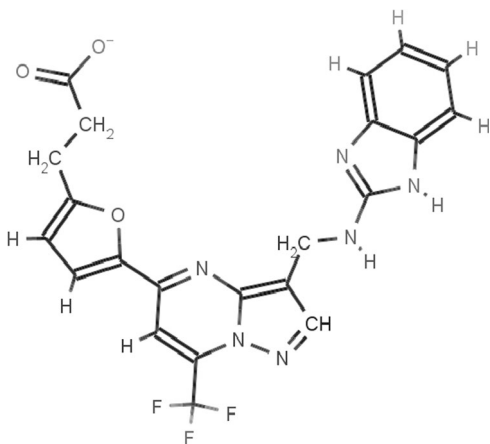


Fig. 9 Scaffold of molecule 9 designed against MMP-9.

to accommodate changes in Phe-148 (Fig. S13, ESI†). The above study suggests that molecules with a longer alkyl chain protruding towards the cleft formed by the movement of Phe-148 show better affinity against MMP-2. Moreover, while designing molecule 2 the structure and amino acid sequence of the other MMPs were critically examined to come up with a molecule showing high affinity as well as specificity against MMP-2. The S1' loop of MMP-2 is two amino acids shorter than MMP-8 due to which there is an extra hump at the bottom of the loop before converging with MMP-2. The non-conservative substitution Thr-143 in

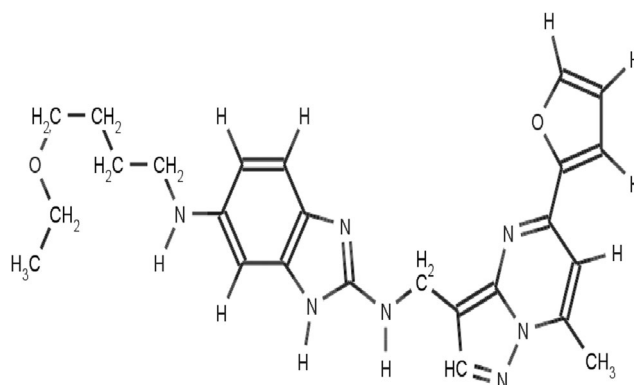


Fig. 10 Scaffold of molecule 13 designed against MMP-13.

MMP-2 or Ala-240 in MMP-8 and Thr-145 in MMP-2 or Arg-243 in MMP-8 throw in differences in the inhibitory pattern of MMP-2 and MMP-8. In the uninhibited MMP-8<sup>82</sup> residue Arg-243 obstructs the S1' groove due to which molecule 2 with a longer alkyl chain failed to fit in the S1' groove of MMP-8. Similarly, inhibitors with long substituents protruding into the S1' inhibit MMP-2 (Fig. S13, ESI†) but fail to inhibit MMP-9 due to occlusion by<sup>1,83</sup> Arg 424 (Fig. S16, ESI†). A structural alignment of MMP-2 and MMP-9 shows an equivalent Pro-429 and Pro-430 in MMP-9 corresponding to Phe-148 and Arg-149 in MMP-2 which does not offer enough conformational flexibility to accommodate molecules with longer alkyl chains in MMP-9. Molecule 2 showed lesser affinity against MMP-3 and MMP-13 due to a longer S1' groove of the same as evident from Table 1 making the molecule specific to MMP-2.

The S1' channel of MMP-3 includes Leu-197, Val-198, His-201, Leu-218, Tyr-220, along with S1' wall residues as highlighted in Fig. 5. While designing molecule 3 the length of the P1' group was increased in comparison to molecule 2 to make it more specific towards MMPs with a deeper S1' site as in MMP-3 in comparison with MMP-1, MMP-2, MMP-8 and MMP-9. A carboxylate group was introduced at the terminal towards the floor of the S1' site at the end of the hydrophobic



chain which could show hydrogen bonding interaction with Arg 233 in MMP-3. A possible alternative would have been an electropositive group showing interaction with Asp-228. However, a carboxylate group interacting with arginine can be considered to have more conformational flexibility than Asp-228. This interaction would maintain a tight fitting of molecule 3 in the S1' site along with the electrostatic interaction of the N1 atom of molecule 3 with the zinc ion (Fig. S14, ESI†). The docked complex was subjected to molecular dynamics simulations. The Arg-233 (Fig. S14, ESI†) during simulation contributed to an induced fit interaction towards the carboxylate group of molecule 3 along with a good hydrophobic fit in the S1' groove and an electrostatic interaction with the zinc ion. A structural superimposition of MMP-3 and MMP-13 shows an equivalent Met-232 to Arg-233 in MMP-13 providing a scope for designing specific inhibitors against MMP-3 (Table 1).

Molecule 8 was designed to show high affinity against MMP-8. The key residues in MMP-8 to bring in affinity as well as specificity can be accredited to Arg-243 and Asn-239 (Fig. S15, ESI†). The orientation of the carboxylate group in molecule 8, which can interact with Arg-243 and an electro-negative fluorine atom to show hydrogen bonding with the Asn-239 (Fig. S15, ESI†), was designed along with an N1 atom of molecule 8 chelating with the zinc ion. These residues vary sequentially as well as structurally in other MMPs (Fig. 5) in the S1' region. The unique conformation of molecule 8 resulting due to the carboxylate groups and the trifluoromethyl group at the terminal of molecule 8 made the above residues acquiescent to interact favorably with MMP-8 (Fig. S15, ESI†) and poorly with other MMPs due to steric clashes.

The S1' pocket of MMP-9 consists of Asp-185–Leu-188 and Pro-421–Tyr-423. The S1' wall comprises<sup>1,84,85</sup> Leu-188, Leu-397, Val-398, His-401, Leu-418, Met-422 and Tyr-423. The catalytic sites of MMP-2 and MMP-9 show high degree of similarity but with variations in the S1' loop region. The orientation of the equivalent residues Arg424 and Thr 426 in the S1' pocket of MMP-9 and MMP-2 respectively causes difference in the overall shape and size of the S1' pocket. Inhibitors with long substituents protruding into the S1' inhibit MMP-2 (Fig. S13, ESI†) but fail to inhibit MMP-9 due to occlusion by Arg-424 and *vice versa* (Fig. S16, ESI†). Molecule 9 designed specifically to bind MMP-9 showed lesser binding to MMP-2, MMP-3, MMP-8 and MMP-13 as the molecule did not make a way inside the groove due to steric clashes and failed to show favorable interaction with the equivalent residues in the S1' region. Molecule 9 comprised of three sub-fragments. The fragment with a zinc chelating N atom (Fig. S16, ESI†), and a P1' fragment with a carboxylate group at the terminal showing hydrogen bonding with Arg 424 with an aromatic linker carrying a trifluoromethyl group maintains a good fit of molecule 9 at the catalytic and S1' sub site of MMP-9. Molecule 2, molecule 9 and molecule 8 showed lesser affinity against MMP-3 and MMP-13 due to a longer S1' groove of the same as evident from Table 1.

The specificity loop of MMP-13 shows flexibility<sup>86</sup> when it is in contact with inhibitors which is critical for binding. The meticulous conformation of S1' loop defines its shape and size.

The conformational restriction appears obvious for the other MMPs with shorter specificity loop regions in MMP-1, MMP-2, MMP-8 and MMP-9. However, for MMPs with similar or longer specificity loops as in MMP-3, the nature of the residues in the specificity loop region (Fig. 5) in MMP-13 and their conformations are the structural determinants for high MMP-13 selectivity. Molecule 13 (Fig. S17, ESI†) was designed to show specificity against MMP-13 by fitting well in the S1' groove with a hydrogen bond interaction with Thr-245 and Thr-247 in comparison to MMP-3 which has an equivalent Leu-226 which restricts conformational flexibility to the equivalent residues. Gly-248 in MMP-13 provides conformational flexibility in this position allowing the neighboring residues Thr-245, Tyr-246, Thr-247 to interact with the inhibitor molecules by providing room for induced fit interaction with the ligand molecule.

The fragments added or modified in the starting hit molecule obtained from the RASPD module, was not inspired from any molecule already in use for the MMPs but was designed to come up with important pharmacophoric suggestions for each MMPs studied. The functional groups/fragments added were varied according to the length of the S1' site and the key residues discussed in different MMPs in order to account for the specificity and affinity of the designed molecules. The quality of chemical collection increases if the compounds have drug like properties. A well known rule of five developed by Lipinski has been a milestone of filtering techniques. The rule identifies compounds that are likely to exhibit good bioavailability. The molecular weight, log *P*, number of hydrogen bond donor and number of hydrogen bond acceptor atoms were calculated using the Lipinski module of *Sanjeevini* web server. The values are reported in Table S3 (ESI†) signifying the drug like properties of the molecules designed. Additionally, synthesizability of the proposed molecules albeit with a large number of synthetic steps has been confirmed. Further synthesis of these molecules or similar molecules satisfying the pharmacophoric/geometric criteria to interact with the key residues highlighted in different MMPs and further *in vitro* experimental test is conceivable in near future.

### Free energy analyses

The semi empirical methodology (BapplZ/MD) adopted has been reported to accurately predict the electrostatics, van der Waals, hydrophobicity and loss in conformational entropy of protein side chains upon ligand binding and an approach to model the interactions of zinc with the other atoms. The MMPs belong to a highly flexible class of proteins especially the S1' site which is considered to bring in specificity for the hit molecules while binding against different MMPs. To fully understand the role of structural adaptation in cases where flexibility could be an important issue *i.e.* when significant structural changes in the target and the ligand are expected upon binding, one must perform an additional initial state (before binding) *versus* the final state (after binding) analysis. Thus a *post facto* MMGBSA (modified generalized Born solvent accessibility) analysis of the trajectories of the bound protein–inhibitor complex and the unbound protein and ligand was





performed to further understand the energetic consequences of flexibility and structural adaptation.<sup>74,75</sup> Here, the net binding free energy is considered to be a sum of the free energy changes due to rotational translational entropy losses, deformation or adaptation expense, van der Waals interactions between the protein and ligand, and net electrostatics and cavitation term. The net electrostatics includes the Coulomb interaction between protein and the ligand and the electrostatic component of solvation. The thermodynamic cycle to obtain the standard free energy of complex formation comprising the above energy components has been discussed in Fig. 2 of Jayaram *et al.* The modified MMGBSA method was applied to the docked structures collected over the last 4 ns trajectories for the molecules designed and an averaging was done to study the various components contributing towards binding free energy. The average binding free energy and the various components contributing towards the binding free energy for the docked molecule 2, molecule 3, molecule 8, molecule 9 and molecule 13 against their respective MMPs have been shown in Fig. S18 (ESI<sup>†</sup>). The direct electrostatics, van der Waals interactions and the hydrophobic interactions favour the binding of protein and the designed molecules. The electrostatic and the van der Waals component of desolvation, the deformation and the rotational translational entropy disfavour complexation. Overall, the MMGBSA analyses indicate that despite the flexibility of the target proteins, the designed molecules retain their binding affinity. Different terms or descriptors are generally employed in any scoring function to obtain a binding free energy estimate of the docked protein–ligand complexes. Both empirical (*BapplZ*) and the MMSGSA methodologies have been adopted in the current work for addressing different components of binding generating a hit molecule with high affinity and specificity against the target MMPs. While the overall picture remains similar to empirical energy function analyses, the overall binding free energies being negative suggesting a hit against the corresponding MMPs, the MD trajectory analyses take into account structural adaptation of the interacting molecules and role of solvation/desolvation effects in binding more explicitly. The magnitudes of the components provide a good indicator to the order of importance of the energy components favourable to binding and prove valuable in design efforts.

The docking and scoring methodology adopted in the current study including a QM/MM based method to derive charges on the docked protein–ligand complex was compared with some of the previously reported work in the literature where a binding free energy calculation was done using Autodock software on 16 known inhibitors<sup>87</sup> of MMPs. The predicted binding free energies of the top ranked docked structure reported by Autodock and the *Sanjeevini* software are shown in Table S2 (ESI<sup>†</sup>). A correlation coefficient *r* of 0.59 and 0.87 were obtained by Autodock and *Sanjeevini* software respectively between the experimental and the predicted binding free energies. Molecules showing activity against some of these MMPs like MMP-9 have been reported using pharmacophore based approaches with a focus on the S1 subsite.<sup>88</sup> In the present study, a protein structure based approach is used to

design inhibitors against the five classes of MMPs. Selectivity being the major issue, a protein structure based approach using a robust and high accuracy docking and scoring methodology followed by a molecular dynamics simulation study has an edge in comparison to the pharmacophore based design of MMP inhibitors. Moreover a comparison between the S1' site followed by a cross docking and scoring approach (Table 1) between different MMPs as carried out in the present study *versus* a consideration of the S1 site alone of a particular MMP as done previously (Kalva, Azhagiya *et al.* 2014<sup>88</sup>) can help in the design of more specific inhibitors against each class of the MMPs.

## Conclusions

Rational design of specific MMP inhibitors has been challenging due to various isomorphs belonging to the above family of enzymes having very flexible binding sites. The docking and scoring module of *Sanjeevini* used in the current work was successful in giving a high correlation between the experimental and predicted binding energy for MMP inhibitors with known crystal structures. A high accuracy docking and scoring methodology, an accurate QM/MM approach to calculate charge on the docked protein ligand complex followed by molecular dynamics simulations, gave a high correlation between the experimental and predicted binding energy for a known MMP inhibitor (Batimastat) with an unknown crystal structure. An MMGBSA analysis accounts for various computational challenges like receptor flexibility and induced fit effects. Further, a comparison between the S1' site followed by a cross docking and scoring approach (Table 1) between different MMPs as carried out in the present study *versus* a consideration of the S1 site alone of a particular MMP can help in the design of more specific inhibitors against each class of MMPs. Certain key residues are identified in S1' sites of different MMPs to design molecules with suitable fragments to hold a stable coordination with the zinc ion and a proper fit in the S1' site to address the affinity and specificity issues.

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