Homology modeling, docking and structure-based pharmacophore of inhibitors of DNA methyltransferase

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Abstract DNA methyltransferase 1 (DNMT1) is an emerging epigenetic target for the treatment of cancer and other diseases. To date, several inhibitors from different structural classes have been published. In this work, we report a comprehensive molecular modeling study of 14 established DNTM1 inhibitors with a herein developed homology model of the catalytic domain of human DNTM1. The geometry of the homology model was in agreement with the proposed mechanism of DNA methylation. Docking results revealed that all inhibitors studied in this work have hydrogen bond interactions with a glutamic acid and arginine residues that play a central role in the mechanism of cytosine DNA methylation. The binding models of compounds such as curcumin and parthenolide suggest that these natural products are covalent blockers of the catalytic site. A pharmacophore model was also developed for all DNMT1 inhibitors considered in this work using the most favorable binding conformations and energetic terms of the docked poses. To the best of our knowledge, this is the first pharmacophore model proposed for compounds with inhibitory activity of DNMT1. The results presented in this work represent a conceptual advance for understanding the protein-ligand interactions and mechanism of action of DNMT1 inhibitors. The insights obtained in this work can be used for the structurebased design and virtual screening for novel inhibitors targeting DNMT1.

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J. Yoo · J. L. Medina-Franco (☒) Torrey Pines Institute for Molecular Studies, 11350 SW Village Parkway, Port St. Lucie, FL 34987, USA e-mail: jmedina@tpims.org **Keywords** Cancer · DNMT · Docking · Epigenetics · Homology model · Pharmacophore

Introduction

DNA methylation at the C5-position of cytosine plays important roles for the epigenetic regulation for gene expression and maintenance for genome integrity, such as genomic imprinting and X-chromosome inactivation [1, 2]. Hypermethylation of the promoter CpG islands that lead to transcriptional silencing of tumor suppressor genes is a general feature in all kinds of cancers. Consequently, development of inhibitors of DNA methylation is a new promising strategy for the treatment of cancer, immunodeficiency and brain disorders [2–4].

DNA methylation is catalyzed by DNA methyltransferases (DNMTs). This is a family of enzymes that transfer a methyl group from S-adenosyl-L-methionine (AdoMet) to the carbon-5 position of cytosine residues. To date, three types of DNMT have been identified in the human genome, including two de novo methyltransferases (DNMT3A and DNMT3B) and the maintenance methyltransferase (DNMT1), which is the most abundant of the three [5–7]. The protein DNMT3L has high sequence similarity with the DNMT3A enzyme, but it lacks any catalytic activity owing to the absence of conserved catalytic residues. However, DNMT3L is required for the catalytic activity of DNMT3A and 3B [8]. The protein DNMT2 can be found in mammalian cells. Despite the structure of DNMT2 being similar to that of other DNMTs, its role is comparably less understood [9]. It has been reported that DNMT2 does not methylate DNA but instead methylates aspartic acid transfer RNA (tRNAAsp) [10]. More recent experiments suggest that DNMT2 activity is not



S-Cys1225 AdoMet-S-CH
$$_3$$
 H S-Cys1225 AdoHcy-S H S-Cys1225 AdoHcy-S H $_3$ C S-Cys125 AdoHcy-S H $_3$ C S-Cys1225 AdoHcy-S H

Fig. 1 Mechanism of DNA methylation. Amino acid residue numbers are based on the homology model herein developed. Equivalent residue numbers in the M.HaI crystal structure of residues shown here are Cys81, Glu119, and Arg165

limited to tRNA^{Asp} and that DNMT2 represents a noncanonical enzyme of the DNMT family [9].

Figure 1 shows the proposed mechanism of DNA methylation [11–13]. The DNA cytosine C5 methylation occurs in the catalytic binding site of DNMT1 using AdoMet. The nucleophile attack on the target cytosine C6 by the thiol group of cysteine residue, produces a covalent intermediate between the enzyme and DNA. The activated C5 position of cytosine conducts a nucleophilic attack on the methyl group of the methyl-donating cofactor AdoMet to form the 5-methyl covalent adduct and *S*-adenosyl-L-homocysteine (AdoHcy). The attack on the C6 position is assisted by a transient protonation of the cytosine ring at the endocyclic nitrogen atom N3 which is stabilized by a glutamate residue (Glu1265). The high-energy carbanion may also be stabilized by resonance where an arginine residue (Arg1311) plays an important role in the catalytic mechanism.

To date, several classes of DNMT1 inhibitors have been reported. In this work, DNMT inhibitors are classified into four major groups mainly depending on the associated mechanism of inhibition (Table 1): (1) Nucleoside analogues such as 5-azacytidine [14–18], decitabine [19–23], 5-fluoro-2'-deoxy-cytidine [24, 25], and zebularine [26–30]; (2) non-nucleoside inhibitors and putative covalent blockers. This group includes curcumin [31–33], parthenolide [34– 38], and RG108-1 [39], a maleimide analogue of RG108 (vide infra); (3) non-nucleoside and non-covalent blockers such as hydralazine [40-44], procaine [45-47], procainamide [41, 48], (-)-epigallocatechin-3-gallate (EGCG) [49– 53], and mahanine [54, 55]; and (4) non-covalent blockers identified from virtual screening such as RG108 [56-58] and NSC14778 [59, 60]. Some of these compounds are drugs approved for other indications such as hydralazine, procaine, and procainamide (vide infra). Curcumin, parthenolide, EGCG, and mahanine are natural products. To date, only 5-azacytidine and decitabine have been developed clinically. These two drugs, after incorporation into DNA, cause covalent trapping and subsequent depletion of DNMT. Aza nucleosides are FDA approved for the treatment of myelodysplastic syndrome, where they demonstrate significant, although usually transient improvement in patient survival and are currently being tested in many solid cancers [16, 61, 62]. Therefore, there is an urgent need to discover and optimize novel DNMT inhibitors. To this end, computational studies are promising to help to elucidate the basic structural requirements of the inhibitors for activity [63]. Indeed, docking models have been proposed for some inhibitors [63]. However, previously reported docking studies were conducted for few ligands using different docking programs, protocols, and different homology models.

The objective of this work was to get insights into the key protein–ligand interactions of DNMT1 inhibitors. To this end, we docked a comprehensive set of DNMT1 inhibitors with a homology model of the catalytic domain of human DNMT1 (hDNMT1). Homology models of hDNMT1 have been useful for the computational study of DNMT1 inhibitors [63]. Here we also propose the first pharmacophore model for DNMT1 inhibitors using a recently developed and validated structure-based approach. The findings of this work will be useful for the virtual screening, structure-based design, and optimization of DNMT1 inhibitors.

Experimental section

Homology model of hDNMT1

The sequence of the human DNMT1 was taken from the UniProt [64] (entry P26358); and the 1133rd to 1601st residues, which correspond to the catalytic domain, were



extracted. The hDNMT1 sequence was aligned based on the sequence of DNA methyltransferases M.HhaI (Protein Data Bank code 6MHT), M.HaeIII (1DCT) and DNMT2 (1G55) and built based on the template 3D structures using Prime (Prime, v2.2, Schrödinger, LLC, New York, NY) [65]. AdoHcy was included in this model, and the DNA double helix was constructed from the structure of M.HhaI. The variable small loops and gaps were filled by knowledge-based homology or ab initio approach of ORCHES-TRAR [66], and then the missing long loop was modeled using the Loop Search module implemented in Sybyl 8.0. The loops showing the highest homology and the lowest root mean square deviations were selected. The side chains and hydrogen atoms were added, and the stability of the homology model was validated by checking the geometry using PROCHECK [67]. The homology model coordinates were then energy minimized with Schrödinger Macromodel module (Macromodel, version 9.8, Schrödinger, LLC, New York, NY) using MMFFs force field in a water environment until converging at a termination gradient of 0.05 kJ/mol-Å. The H-bonds were fixed using the SHAKE algorithm during molecular dynamics.

Molecular docking

The starting conformation of ligands was obtained by the Polak-Ribiere Conjugate Gradient (PRCG) energy minimization using the OPLS 2005 force field of 5,000 steps or until the energy difference between subsequent structures was 0.001 kJ/mol-Å [68]. In order to generate the grids for docking, the DNA double helical structure was removed from the homology model of hDNMT1. The target cytidine was used as the reference ligand to generate the grids. The binding site was generated by grids with a default rectangular box centered on the target cytidine. Ligands were docked into the catalytic binding site of hDNMT1 with Glide extra precision (XP) (Glide, version 5.6, Schrödinger, LLC, New York, NY). XP descriptors were generated to obtain atom-level energy terms such as hydrogen bond interaction, electrostatic interaction, hydrophobic enclosure and pi-pi stacking interaction during the docking run. The best docking poses were selected to generate the pharmacophore features.

Structure-based pharmacophore (e-pharmacophore)

The structure-based pharmacophore was generated using the optimized, best scoring pose, and descriptors of the Glide XP score for all 14 inhibitors. To this end, we used the recently developed energy-optimized pharmacophore (e-pharmacophore) approach that is based on mapping of the energetic terms from the Glide XP scoring function onto atom centers [69, 70]. Briefly, the docking models of the inhibitors were refined using Glide XP, the Glide XP scoring terms were computed, and the energies were mapped into atoms. Then, the pharmacophoric sites were automatically generated with Phase (Phase, v3.2, Schrödinger, LLC, New York, NY) using the default set of six chemical features: namely, hydrogen bond acceptor (A), hydrogen bond donor (D), hydrophobic (H), negative ionizable (N), positive ionizable (P), and aromatic ring (R) site. The Glide XP energies from the atoms that comprise each pharmacophoric site were summed. The pharmacophoric sites were then ranked based on the summed energies, and the most favorable sites were selected for the pharmacophore hypothesis. Further details of the e-pharmacophore method are published elsewhere [69, 70]. In other words, each pharmacophore feature was assigned with an energetic value that was the sum of the Glide XP contributions of the atoms comprising the site. The sites were quantified and ranked on the basis of these energetic terms [69, 70]. These features were used to develop a common pharmacophore model that was evaluated on its ability to reproduce known inhibitors using Phase. The distance matching tolerance was set to 2.0 Å. To account for protein flexibility and lessen the effects of minor steric clashes, excluded volumes spheres were created for all receptor atoms within 5 Å around each ligand. Each sphere has a radius corresponding to 50% of the van der Waals radius of the receptor atom. Receptor atoms less than 1.5 Å from the ligand were ignored. The combination of best-scoring features that matched a minimum of two sites in each known inhibitor were chosen and regenerated [69, 70].

Results and discussion

Homology model of the catalytic domain of hDNMT1

The homology model of the catalytic binding site of hDNMT1 herein developed was consistent with the mechanism of DNA methylation (Fig. 2a). The target cytidine (adopted from the HhaI-DNA structure) is located between the nucleophile Cys1225 and sulfur atom of AdoHcy (Fig. 2b). The distance of cytosine C6 to the sulfur atom of Cys1225 is 3.3 Å. The cytosine C5 atom is 3.0 Å away from the sulfur atom of AdoHcy. In addition, the N3 protonated form of cytosine can make hydrogen bonds with Glu1265, Arg1311, and Pro1223. This is in full agreement with the proposed catalytic mechanism of DNA methylation (Fig. 1). The α -phosphate backbone of deoxycytidine makes a hydrogen bond network with Arg1311, Ser1229, and Gly1230. In addition, the 3'-OH of the sugar moiety forms hydrogen bonds with Arg1461 and Gln1396. The geometry of the catalytic site suggests that the homology



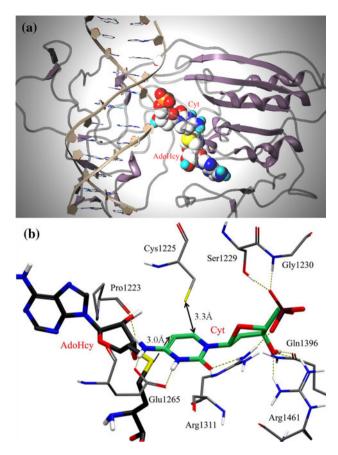


Fig. 2 a Homology model of hDNMT1-AdoHcy-DNA. Cytidine and AdoHcy are shown as space-filling (CPK) models; hDNMT1 is shown as ribbons. **b** Binding mode of N3 protonated deoxycytidine (carbon atoms in *green*) in the catalytic domain of hDNMT1 (carbon atoms in *gray*). AdoHcy (carbon atoms in *black*) is shown for reference. See the online version of the manuscript for colors

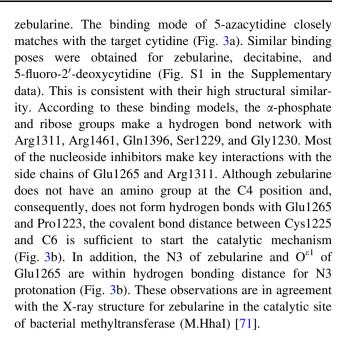
model of hDNMT1 is reliable to *explore* the binding mode of hDNMT1 inhibitors.

Molecular docking

Fourteen established known hDNMT1 inhibitors (Table 1) were docked into the optimized catalytic binding site of the homology model. The docking models of the DNMT1 inhibitors are discussed in four major sections following the classification presented in Table 1. It is worth pointing out that there are no reports of the enzymatic inhibitory activity of the 14 inhibitors tested under the same assay conditions. Therefore, a direct correlation between docking scores (Table S1 in the Supplementary data) and enzymatic activity is not representative.

Nucleoside analogues

Figure 3 shows the docked poses of selected nucleoside inhibitors e.g., cytosine analogues, 5-azacytidine, and



Non-nucleoside and putative covalent blockers

Curcumin has several pharmacological properties including antitumor, anti-inflammatory, anti-angiogenic, antioxidant, and wound healing [72]. Based on docking studies with Autodock using a homology model of hDNMT1, Liu et al. recently suggested that curcumin covalently blocks the thiolate of catalytic cysteine of DNMT1 [33]. This observation is largely in part because of the α,β -unsaturated carbonyl group of curcumin. In this work, we further examined the binding mode of curcumin with Glide using the herein developed homology model of the catalytic domain of hDNMT1. Figure 4a shows the binding mode of curcumin. According to this model, one of the 4-hydroxy-3-methoxyphenyl groups occupies a similar binding position as the base ring of 5-azacytidine and forms hydrogen bonds with Glu1265 and Arg1311. Moreover, the diketone groups of curcumin make hydrogen bonds with the side chains of Gln1226 and Lys1462. In this binding position, the α,β -unsaturated carbonyl is 2.8 and 3.3 Å away from the sulfur atom of catalytic Cys1225. The other 4-hydroxy-3-methoxyphenyl group of curcumin forms a hydrogen bond with the side chain of His1458 and the carbonyl backbone of Leu1454. This result supports the hypothesis that curcumin has the potential to inhibit the DNMT1 catalytic function through covalently blocking the catalytic thiolate of Cys1225. Furthermore, this result is in good agreement with the docking studies reported previously by Liu et al. [33] despite the fact that we used a different homology model and docking protocol.

The sesquiterpene lactone parthenolide is found in the anti-inflammatory medicinal herb feverfew. Parthenolide has reported inhibitory activity of the nuclear transcription



Table 1 Inhibitors of DNA methylation considered in this study

Compound	Structure	Target(s)	Testing Stage	References
	Nuc	cleoside analogue	es	
5-Azacytidine	NH ₂ N N OH OH	DNMT1, other enzymes	Approved by FDA in 2004; Pharmion Corp.	[14-18]
Decitabine	NH ₂ N N OH H	DNMTs	Approved by FDA in 2006; MGI Pharma	[19-23]
Zebularine	HO O O O O O O O O O O O O O O O O O O	DNMT1, other enzymes	Preclinical	[26-30]
5-Fluoro-2'- deoxycytidine	NH ₂ F N N OH H	DNMTs	Phase I	[24,25]
	Non-nucleoside	and putative cova	alent blockers	
Curcumin	но	DNMT1, other enzymes	Phase I: Breast cancer Phase II: Pancreatic cancer	[31-33]
Parthenolide		DNMT1, other enzymes	Phase I: anti-tumor anti- angiogenic Preclinical: Anti-inflammatory	[34-38]
RG108-1	0.1.0 H	hDNMT1	In vitro	[39]
	Nor	-covalent blocker	rs	
Hydralazine	7 HN NH ₂	DNMTs	Phase II: Breast cancer Phase III: Cervical and ovarian cancer	[40-44]
Procaine	H ₂ N N	DNMTs / CpG- rich sequences	Phase II	[45-47]
Procainamide	H ₂ N N	DNMTs / CpG- rich sequences	Preclinical	[41,48]
EGCG	OH OH OH OH OH OH	DNMT1, other enzymes	Phase I	[49-53]
Mahanine	но	DNMTs	In vitro: Human prostate cancer cells	[54,55]
	Non-covalent blocke	rs identified from	n virtual screening	
RG108	N H	DNMTs	Preclinical	[56-58]
NSC14778	- ;;	DNMT1, other enzymes	In vitro: Human and dengue virus methyltransferase	[59,60]



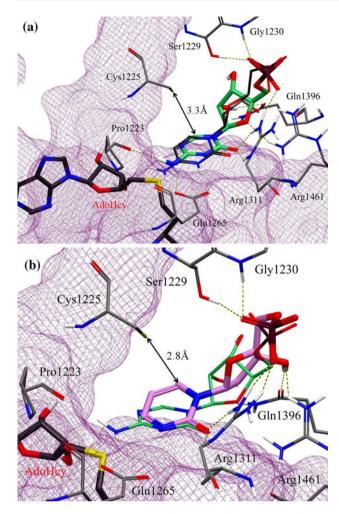


Fig. 3 Comparison of binding modes of nucleoside inhibitors, **a** 5-azacytidine (carbon atoms in *green*) with deoxycytidine (carbon atoms in *dark gray*) and **b** zebularine (carbon atoms in *pink*). See the online version of the manuscript for colors

factor (NF- κ B) through covalent blocking the thiol group of cysteine in the active site of NF- κ B [34–36]. This natural product also has been identified as an effective hypomethylating agent. Previous docking studies with DNMT1 suggested that parthenolide covalently blocks the DNMT1 active site [38]. To further support this hypothesis, we docked this compound using our homology model. Figure 4b shows the optimized binding pose of parthenolide using Glide XP. In this binding model, the methylene atom of parthenolide is 2.9 Å away from the sulfur atom of the catalytic Cys1225. This is in agreement with the putative formation of a covalent adduct between DNMT and parthenolide. Indeed, the methylene atom of parthenolide overlaps with the C6 atom of the base ring of 5-azacytidine. This natural product also forms hydrogen bonds with three arginine residues namely Arg1311, Arg1309, and Arg1461.

RG108-1 (Table 1) is a maleimide analogue of RG108 (vide infra). Suzuki et al. [39] previously docked RG108-1

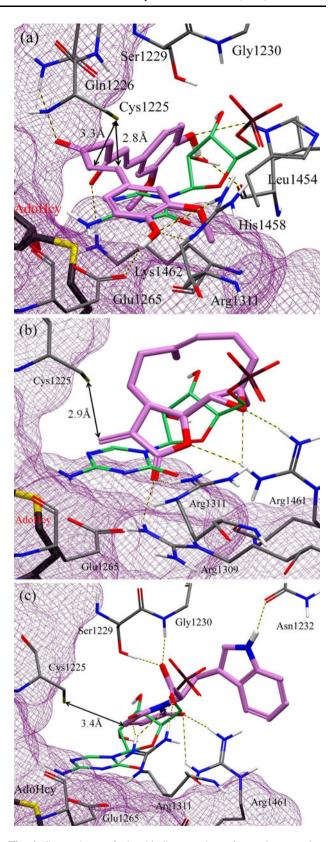
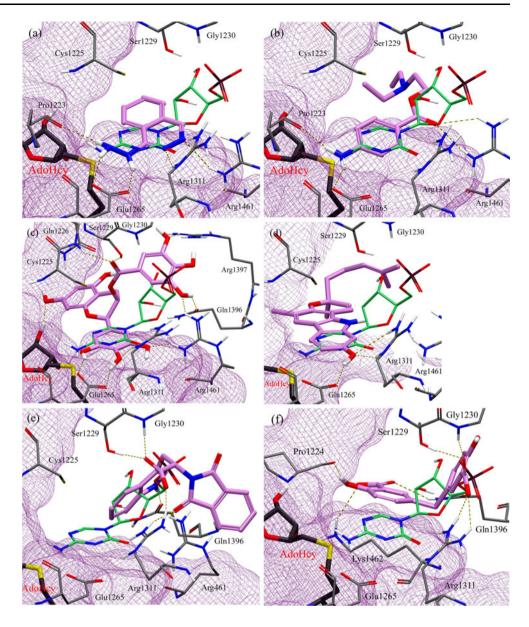


Fig. 4 Comparison of the binding modes of putative covalent blockers (carbon atoms in pink), **a** curcumin, **b** parthenolide, and **c** RG108-1 with 5-azacytidine (carbon atoms in green). See the online version of the manuscript for colors



Fig. 5 Comparison of the binding modes of non-covalent blockers (carbon atoms in *pink*) with 5-azacytidine (carbon atoms in *green*). Drugs used in other indications: a hydralazine and b procaine; Natural products: c EGCG and d mahanine; Virtual screening hits: e RG108 and f NSC14778. See the online version of the manuscript for colors



with an X-ray structure of bacterial M.HhaI concluding that this maleimide derivative may act as a covalent blocker. Herein, we further tested this hypothesis but using a model of the human DNMT1. Figure 4c shows a comparison of the binding model of RG108-1 with 5-azacytidine that is displayed as a reference. The carboxylate anion of RG108-1 overlaps with the phosphate anion of 5-azacytidine and has the same interaction with Arg1311, Ser1229, and Gly1230. Interestingly, the maleimide moiety of RG108-1 interacts with Arg1311 and Arg1461 and lies across the sugar ring of 5-azacytidine, where the conjugate addition of a thiol to the maleimide can occur. The indole ring of RG108-1 forms a hydrogen bond with Asn1232. These results further supports the previous hypothesis that RG108-1 is a covalent blocker of hDNMT1.

Non-covalent blockers

Hydralazine is an antihypertensive drug. Using a drug repurposing strategy [73], clinical trials have demonstrated the antitumor effect of the combination of hydralazine with valporic acid (a histone deacetylase inhibitor) [74]. Figure 5a shows the comparison of the binding modes of hydralazine with 5-azacytidine. The amino group of hydralazine matched well with the amino group of 5-azacytidine, and it is capable of forming a hydrogen bond with Glu1265 and Pro1223. The nitrogen of the phthalazine ring overlapped with the carbonyl oxygen of 5-azacytidine and formed hydrogen bonds with Arg1311 and Arg1461. This result also suggests that hydralazine can be substituted at the C4 position (Table 1) to yield analogues with enhanced



affinity with the enzyme. Similar conclusions were obtained using a different homology model and docking program [44].

Procaine and procainamide are approved drugs as local anesthetic and for the treatment of cardiac arrhythmias [17, 48], respectively. Figure 5b shows the binding mode of procaine. The binding mode of procainamide was the same (Fig. S1 in the Supplementary data). The amino group of procaine overlapped with that of 5-azacytidine and made a hydrogen bond with Glu1265 and Pro1223. Moreover, the carbonyl oxygen of these two ligands was close to the binding position of oxygen of the ribose ring of 5-azacytidine making a similar hydrogen bond with Arg1461.

Figure 5c shows the binding mode of EGCG, the main polyphenolic component of green tea. According to this binding model, the B ring of EGCG (Table 1) was oriented at the same position as the base ring of 5-azacytidine forming hydrogen bonds with Glu1265 and Arg1311, residues relevant in the mechanism of methylation. Arg1461 stabilize the B and D ring through hydrogen bonds with the hydroxy atoms of the two rings. The D ring makes interactions with Gln1396 and Arg1397. The ketone group of EGCG forms hydrogen bonds with the backbone of Gln1226 and the hydroxy group of the side chain of Ser1229. Interestingly, the hydroxy group of the A ring forms a hydrogen bond with the 2'-OH of the sugar ring of AdoHcy. These findings suggest that EGCG inhibits DNMT1 by blocking the catalytic active site. The overall binding conformation of EGCG is slightly different from the previously reported binding mode using a different homology model and docking method [49, 75]. However, the published models also predict the formation of hydrogen bonds with Ser1229, Glu1265, and Arg1309.

The antiproliferative effect of mahanine, a naturally occurring carbazole alkaloid, has been associated with the inhibition of DNMT activity [54]. The docking study of mahanine in the active site of DNMT is not published. Figure 5d shows the binding mode of mahanine within the catalytic site of hDNMT1. The binding model is characterized by the formation of hydrogen bonds with key amino acid residues, Glu1265 and Arg1311.

RG108 is a novel DNMT inhibitor that was discovered by docking-based virtual screening of the National Cancer Institute (NCI) database using a homology model of hDNMT [58]. RG108 was reported to induce the re-expression of different hypermethylation silenced genes, such as p16 and the putative tumor suppressor genes SRFP1 and TIMP-3, in colon cancer cells [56]. Figure 5e shows the binding model of RG108 obtained with our homology model. 5-Azacytidine is displayed for reference. The carbonyl atom of the phthalimide ring of RG108 forms hydrogen bonds with Arg1311 and Arg1461. The NH of the indole ring interacts with Gln1396 in a similar manner

as the 2'-OH of the sugar moiety of 5-azacytidine. In addition, the carboxylate anion of RG108 roughly overlaps with the phosphate anion of 5-azacytidine having a similar hydrogen bond pattern with Arg1311, Ser1229, and Gly1230. The binding mode of RG108 proposed with our homology model is similar to the binding mode previously reported with a different homology model [58]. A comparison with the binding mode of RG108 and RG108-1 is shown in the Supplementary data (Fig. S2). The carboxylate anions of both compounds overlap. The phthalimide group of RG108 is positioned in the same binding site as the indole ring of RG108-1.

NSC14778 was identified as a novel inhibitor of DNMT1 also by virtual screening of the NCI database [59]. Figure 5f shows the optimized docked model of NSC14778 in the active site. 5-Azacytidine is shown as reference. One of the carboxylate groups makes a hydrogen bond network with the side chains of Arg1311, Ser1229, and Gly1230. This group mimics the interaction of the phosphate of 5-azacytidine. The second hydroxybenzoic acid moiety has contacts with Lys1462, Pro1224, and Gln1396. These observations suggest that NSC14778 might block the active site of DNMT1 non-covalently.

Despite the fact the inhibitors studied in this work involve a range of different scaffolds and alternative binding modes could be possible, the binding models of the 14 hDNMT1 inhibitors showed common hydrogen bond interactions with Arg1311 or Glu1265. These two residues are key amino acids in the mechanism of cytosine DNA methylation (Fig. 1). In addition, several inhibitors also form hydrogen bonds with at least one of the following residues Arg1461, Ser1229 or Gly1230. These results *suggest* that interactions with these residues are pharmacophoric. The specific effects of the inhibitors on the sidechain rearrangements and conformation of the catalytic site of hDNMT1 remain to be determined in a comprehensive manner, for example, using molecular dynamics.

Structure-based pharmacophore hypothesis

As noted above, a number of inhibitors investigated in this work can be classified into different structural classes e.g., nucleosides and non-nucleosides. It would be interesting to explore specific pharmacophoric models for each class of inhibitor depending on the proposed mechanism of action (Table 1). Since all the 14 inhibitors showed common interactions in the docking models with hDNMT1, in this work we decided to develop a pharmacophoric model for all inhibitors that further characterizes the major interactions involved in the ligand–protein recognition process. To develop a pharmacophore hypothesis of the 14 DNMT1 inhibitors, we employed the e-pharmacophore method recently developed and summarized in the "Experimental"



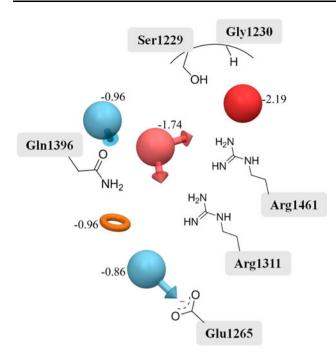


Fig. 6 Structure-based pharmacophore model for DNMT inhibitors. *Red sphere* negative ionizable, *pink sphere* hydrogen bond acceptor, *blue sphere* hydrogen bond donors, and *orange ring* aromatic ring. Selected amino acid residues in the catalytic site are schematically depicted for reference. See the online version of the manuscript for colors

section". This method has the advantage of combining pharmacophore perception with protein-ligand energetic terms, computed with docking, to rank the importance of the pharmacophore features [69, 70]. The best scoring poses and energetic information of the 14 known inhibitors were taken from the docking studies described above. Figure 6 shows the five-feature pharmacophore model for the 14 DNMT1 inhibitors. The energetic value assigned to each pharmacophoric feature is displayed in the figure. The energetic value is equal to the sum of the Glide XP contributions of the atoms comprising the site [70]. Nearby amino acids are schematically depicted for reference. The best-scoring feature is a negative charge which is close to the side chains of Ser1229, Gly1230, and Arg1311. The second most favorable feature is an acceptor site that is in close proximity with the side chains of Arg1311 and Arg1461. The third ranked features are an aromatic ring that stabilizes the binding conformation of ligands between AdoHcy and Cys1225, and a donor site that is close to the side chain of Gln1396. The fifth-ranked feature is a donor site that is nearby the side chain of Glu1265, which is a residue implicated in the methylation mechanism (Fig. 1). The pharmacophore model captures the most important interactions of the 14 DNMT inhibitors. To note, glutamic acid and arginine residues are highly conserved residues in catalytic domains of investigated DNMTs [76]. Figure 7 shows the alignment of representative inhibitors to the pharmacophore hypothesis. Most of the inhibitors matched several pharmacophore features considering a distance tolerance of 2 Å as detailed in the next paragraphs.

The nucleoside analogues, 5-azacytidine, decitabine, and 5-fluoro-2'-deoxycytidine matched with all five pharmacophore features. In comparison, zebularine matches four. This is because zebularine does not have the amine group on the base ring and does not satisfy the hydrogen bonding donor feature associated with the interaction with Glu1265. However, the donor feature can match the N3 protonated form of zebularine (Fig. 7).

Curcumin, procaine, procainamide, and hydralazine matched with the aromatic ring, donor, and acceptor features. Despite the fact hydralazine is a very small structure, the amine atoms of this molecule match with acceptor and donor features that are close to Glu1265 and Arg1311. The B ring of EGCG satisfied both the aromatic ring and the donor nearby Glu1265. The hydroxy group of the D ring matched with the donor close to Gln1396, and the acceptor. The carboxylate anions of RG108, RG108-1, and NSC14778 matched with the negative feature. The maleimide of RG108-1 satisfied the acceptor, while the indole ring matched with the donor that is close to Gln1396 (Fig. 7).

Although NSC14778 matched with only one pharma-cophoric feature, its carboxylate group matched with the best-scored feature, i.e., the negative charge. This model suggests that introduction of a substituent that could match the donor feature associated with the interaction of Glu1265 and acceptor feature may enhance the affinity of NSC14778 with the enzyme. Parthenolide also matched with only one feature, namely, the acceptor site associated with the interaction with Arg1311 and Arg1461. Interestingly, it is possible that the enol form of parthenolide interacts with Glu1265 when the keto-enol tautomerism on the γ -methylene lactone ring occurs through covalent linking with catalytic Cys1225.

These results suggest that the structure-based pharmacophore in Fig. 6 has good agreement with docking studies and represents a key step towards the understanding of the protein–ligand interactions of DNMT1 inhibitors, which is the main goal of this work (vide supra). It remains to evaluate the performance of the pharmacophore model in prospective virtual screening. In such studies, virtual screened molecules could be required to match at least three or four e-pharmacophoric sites [70]. These studies are ongoing in our group and will be reported in due course.

Conclusion

In the present study, we explored the binding mode of 14 DNMT1 inhibitors with a herein developed homology



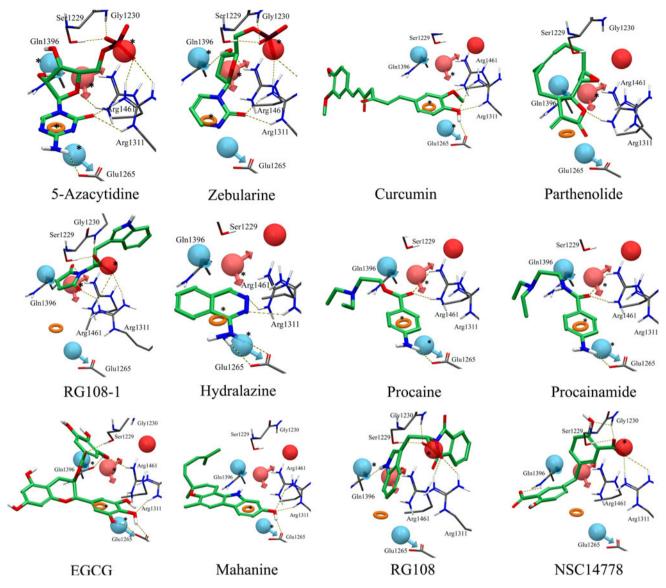


Fig. 7 Comparison between the binding mode and pharmacophore hypothesis for representative DNMT inhibitors. *Red sphere* negative ionizable, *pink sphere* hydrogen bond acceptor, *blue sphere* hydrogen bond donors, and *orange ring* aromatic ring. The *asterisk* denotes the

matching site with the inhibitors. Selected amino acid residues in the catalytic site are shown for reference. See the online version of the manuscript for colors

model of the catalytic domain of hDNMT1. To the best of our knowledge, this is the first study that compares the binding mode of all the inhibitors using the same molecular modeling protocol. The geometry of the homology model was in agreement with the proposed mechanism of DNA methylation. The catalytic site of the homology model includes the residues Cys1225, Glu1265, and Arg1311. Despite the fact that the inhibitors studied in this work have different structural scaffolds, all compounds have common interactions with key amino acid residues such as Glu1265, Arg1311, Arg1461, Ser1229, and Gly1230. The nucleoside analogues, such as 5-azacytidine, decitabine, 5-fluoro-2'-deoxycytidine, and zebularine, have several interactions

with more than five amino acid residues and showed a similar binding position as the modeled cytidine. These results further supported the use of the homology model to explore the binding modes of other inhibitors. Docking results also supported the hypothesis that curcumin, parthenolide, and a maleimide analogue of RG108 are covalent blockers of the catalytic cysteine. The optimized binding modes of the inhibitors were used to construct a structure-based pharmacophore model with five distinct features: namely, one negative charge, one hydrogen bond acceptor, one aromatic ring, and two hydrogen bond donors. The pharmacophore model is in agreement with the binding profile of the inhibitors obtained in docking. Taken



together, the results of this study shed light into the key protein–ligand interactions of the DNMT1 inhibitors. A major perspective of this work is to apply the insights from the docking and pharmacophore model obtained in this work for the virtual screening and structure-based optimization of novel DNMT inhibitors.

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 –418

