## Article

# In Silico Finding of Key Interaction Mediated $\alpha 3 \beta 4$ and $\alpha 7$ Nicotinic Acetylcholine Receptor Ligand Selectivity of Quinuclidine-Triazole Chemotype 

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#### Abstract

The selective binding of six (S)-quinuclidine-triazoles and their $(R)$-enantiomers to nicotinic acetylcholine receptor (nAChR) subtypes $\alpha 3 \beta 4$ and $\alpha 7$, respectively, were analyzed by in silico docking to provide the insight into the molecular basis for the observed stereospecific subtype discrimination. Homology modeling followed by molecular docking and molecular dynamics (MD) simulations revealed that unique amino acid residues in the complementary subunits of the $n A C h R$ subtypes are involved in subtype-specific selectivity profiles. In the complementary $\beta 4$-subunit of the $\alpha 3 \beta 4 \mathrm{nAChR}$ binding pocket, non-conserved AspB173 through a salt bridge was found to be the key determinant for the $\alpha 3 \beta 4$ selectivity of the quinuclidine-triazole chemotype, explaining the 47-327-fold affinity of the (S)-enantiomers as compared to their (R)-enantiomer counterparts. Regarding the $\alpha 7 \mathrm{nAChR}$ subtype, the amino acids promoting a however significantly lower preference for the ( $R$ )-enantiomers were the conserved TyrA93, TrpA149 and TrpB55 residues. The non-conserved amino acid residue in the complementary subunit of nAChR subtypes appeared to play a significant role for the nAChR subtype-selective binding, particularly at the heteropentameric subtype, whereas the conserved amino acid residues in both principal and complementary subunits are essential for ligand potency and efficacy.


Keywords: stereoselectivity; anti-1,2,3-triazole; $\alpha 7$ nAChR; $\alpha 3 \beta 4$ nAChR; quinuclidine

## 1. Introduction

Nicotinic acetylcholine receptors (nAChRs), ligand-gated ion channel receptors (LGICs), can be classified by subunit stoichiometry. The identified neuronal subtypes are at least 12 at present, namely $\alpha 2-\alpha 10$ and $\beta 2-\beta 4[1,2]$. These receptors being activated by the endogenous neurotransmitter
acetylcholine (ACh) play an essential role in the regulation of cation permeation across membranes [3]. The nAChRs are involved in several neuronal dysfunctions related to the cholinergic system. Due to different expression areas of the various subtypes in the brain, compounds acting on each subtype show diverse pharmacological profiles [3,4]. In this context, the $\alpha 7$ and $\alpha 4 \beta 2$ subtypes located mainly in the central nervous system (CNS) have been initially exploited as drug targets in the discovery of drugs for neurodegenerative diseases [5-7]. For example, compounds acting on $\alpha 7$ and $\alpha 4 \beta 2$ nAChRs have been developed as drugs for neuropsychiatric disorders such as Alzheimer's disease, schizophrenia, Parkinson's disease, and autism [8,9]. Nowadays, $\alpha 3 \beta 4$ nAChR has emerged as an attractive therapeutic target for drug addiction as evidenced by its high expression in specific brain regions associated with addiction and reward systems e.g., medial habenula ( MHb ), interpeduncular nucleus (IPN), and pineal gland [10]. Therefore, compounds acting on $\alpha 3 \beta 4 \mathrm{nAChRs}$ can be used for the treatment of drug addiction [11-13].

In the development of drugs acting on nAChRs, the designs are generally based on ACh pharmacophoric structures, the pharmacophore of nAChR ligands being composed of three key substructures: a cationic center, a hydrogen bond acceptor, and a hydrophobic part [14]. Several compounds in preclinical and clinical studies including GTS-21 [15], EVP-6124 [16,17], varenicline [18,19], and AT-1001 [20,21] (Figure 1) have at least 2 pharmacophore features in common. Recently, we have reported quinuclidine-triazole derivatives as potent nAChR ligands, namely IND8, QND8, and (R)-, (S)-T1-T6 [22] (Figure 1). These compounds contain an anti-1,2,3-triazole ring in the structure which acts as a linker to connect a hydrophobic part and the remaining pharmacophoric motifs and also serves as the hydrogen bond acceptor. The key observation is that the stereochemistry of quinuclidine at 3-position is an important determinant for subtype-selective binding, particularly the $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChR}$ binding affinities. The $(R)$-enantiomer dominates the binding to the $\alpha 7$ subtype, whereas its (S)-counterpart predominantly binds to $\alpha 3 \beta 4$ nAChRs [22]. Herein, the computational research into ligand-receptor binding mode which is composed of homology modeling, molecular docking, and a molecular dynamics simulation was performed to identify amino acid residues and interactions mediating the selective binding. This study aimed at a molecular level understanding of the previously observed stereoselective binding of quinuclidine-triazole ligands. The presented rationale for stereoselective $n A C h R$ binding may not only provide a guidance for future experimental work but also trigger a future computational research into potent subtype-specific ligands for nAChR especially to $\alpha 3 \beta 4 \mathrm{nAChR}$ ligands for drug addiction treatment.


Figure 1. Examples of nicotinic acetylcholine receptor ( $n A C h R$ ) ligands.

## 2. Results and Discussion

Our previous study on the nAChR binding affinity of 3-quinuclidine-triazole T1-T6 has revealed that the stereochemistry of quinuclidine at 3-position mediated a subtype-selectivity profile [22]. The information on selective binding of (R)-enantiomers to $\alpha 7 \mathrm{nAChR}$ and (S)-enantiomers to $\alpha 3 \beta 4$ nAChR is based on the eudismic ratios ((S)- vs. (R)-enantiomer binding against $\alpha 3 \beta 4$ subtype and $(R)$ - vs. (S)-enantiomer binding against $\alpha 7$ subtype) in Table 1 . Herein, the binding modes of these six enantiomeric pairs in protonated form were explored to identify key determinants for $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChR}$ selective binding. The key amino acid determinants provide useful information for the design of a subtype-selective ligand. Hence, homology models of human $\alpha 7$ and $\alpha 3 \beta 4$ nAChR were prepared and molecular dockings were performed to investigate the binding modes and to identify the amino acid residues that governed the selectivity. The MD simulation was performed to confirm the determinant residue for subtype selective binding.

Table 1. Structures, binding affinities, eudismic ratios, and subtype selectivity ratios of six enantiomeric pairs T1-T6.

| Cpd |  | $\begin{gathered} \mathrm{K}_{\mathrm{i}} \text { in } \mathrm{nM} \\ (\text { Mean } \pm \text { SD })^{1} \end{gathered}$ |  | Eudismic Ratio ${ }^{2}$ |  | Subtype Selectivity Ratio ${ }^{3}$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | $\alpha 3 \beta 4$ | $\alpha 7$ | $\alpha 3 \beta 4(S / R)$ | $\alpha 7(R / S)$ | $\alpha 3 \beta 4$ | $\alpha 7$ |
| (R)-T1 | $p$-F | $1010 \pm 162$ | $73.0 \pm 15$ |  | 2.4 |  | 14 |
| (S)-T1 |  | $3.09 \pm 0.10$ | $174.5 \pm 66$ | 327 |  | 56 |  |
| (R)-T2 | $m$-F | $362 \pm 27$ | $117 \pm 4$ |  | 5.7 |  | 3.1 |
| (S)-T2 |  | $2.25 \pm 0.42$ | $660.5 \pm 139$ | 161 |  | 294 |  |
| (R)-T3 | $m-\mathrm{O}\left(\mathrm{CH}_{2}\right)_{2} \mathrm{~F}$ | $558 \pm 34$ | $38.8 \pm 8$ |  | 1.9 |  | 14 |
| (S)-T3 |  | $11.8 \pm 0.3$ | $74.9 \pm 20$ | 47 |  | 6.3 |  |
| (R)-T4 | $m-\mathrm{O}\left(\mathrm{CH}_{2}\right)_{3} \mathrm{~F}$ | $1628 \pm 11$ | $62.3 \pm 10$ |  | 1.6 |  | 26 |
| (S)-T4 |  | $19.5 \pm 0.4$ | $96.9 \pm 17$ | 83 |  | 5 |  |
| (R)-T5 | $m$-OBn | $631 \pm 206$ | $22.5 \pm 9$ |  | 12 |  | 28 |
| (S)-T5 |  | $6.67 \pm 0.7$ | $279 \pm 31$ | 95 |  | 42 |  |
| (R)-T6 | $m-\mathrm{OCH}_{2} \mathrm{C}_{6} \mathrm{H}_{4}-p-\mathrm{F}$ | $1090 \pm 163$ | $33.2 \pm 7$ |  | 4.5 |  | 33 |
| (S)-T6 |  | $7.17 \pm 1.2$ | $149 \pm 42$ | 152 |  | 21 |  |

${ }^{1}$ Binding affinities are represented by the inhibition constant $K_{i} .{ }^{2}$ Eudismic ratios are reported in terms of the reciprocal values of the $\mathrm{K}_{\mathrm{i}}$ ratio of $(S)$ - to $(R)$-quinuclidine triazole for the $\alpha 3 \beta 4 \mathrm{nAChR}$ and $(R)$ - to ( $S$ )-quinuclidine triazole for $\alpha 7 \mathrm{nAChR} .{ }^{3}$ Subtype selectivity ratios are reported in terms of the reciprocal ratio of $\alpha 3 \beta 4$ to $\alpha 7 \mathrm{nAChR}$ $\mathrm{K}_{\mathrm{i}}$ values for the $\alpha 3 \beta 4 \mathrm{nAChR}$ and $\alpha 7$ to $\alpha 3 \beta 4 \mathrm{nAChR} \mathrm{K}_{\mathrm{i}}$ values for the $\alpha 7 \mathrm{nAChR}$.

## 2.1. $n A C h R$ Homology Model Templates ( $\alpha 7$ and $\alpha 3 \beta 4$ Subtypes)

The homology models of the extracellular domain (ECD) of $\alpha 7$ and $\alpha 3 \beta 4$ nAChRs were constructed by Modeller9.15 [23]. The criteria for the template selection are 1) using X-ray diffraction to obtain the crystal structure, 2) having a nAChR agonist as ligand, 3) having a high percentage of similarity in amino acid sequence, and 4 ) having a high resolution ( $<2.5 \AA$ ). Based on these selection criteria, we have chosen the X-ray crystal structure of acetycholine binding protein (AChBP, a homolog of the nAChR ligand-binding domain) from Lymnaea stagnalis (Ls-) PDB code 5AFH [24] as the template. Even this template is a chimeric receptor, the carbon backbone is not different from the wild type (PDB code 2BYS) having the same lobeline as a bound ligand. The AChBP has high sequence identity and similarity to the ECD of nAChRs. Its amino acid sequence shows $63.0 \%, 28.6 \%$, and $28.4 \%$ identity to the ECD of human $\alpha 7, \alpha 3$, and $\beta 4$ nAChRs, respectively, whereas the percentage of similarity is higher, that is $71.1 \%, 53.5 \%$, and $48.2 \%$ for human $\alpha 7, \alpha 3$, and $\beta 4$ nAChRs, respectively analyzed by EMBOSS Needle [25]. The AChBP is the most appropriate template to model the ECD of nAChRs because of its considerable secondary structural similarity to the ECD of nAChRs and the high level of sequence identity at the binding site [26]. The key amino acid residues Tyr and Trp in the binding pocket are present in both AChBP and nAChRs. At present, there is only one nAChR crystal structure having both ECD and transmembrane region available in PDB which is the $\alpha 4 \beta 2 \mathrm{nAChR}$ (PDB code 5KXI) [27].

However, this protein structure has been derived from cryo-electron microscopy and the resolution is beyond the limit ( $3.9 \AA$ ). Therefore, the crystal structure of AChBP (PDB code 5AFH) was selected as the protein template in this study. Clustal Omega [28] was used for sequence alignment of the AChBP and the ECD of $\alpha 7$ and $\alpha 3 \beta 4$ nAChRs to generate a total of 100 homology models for each of these two receptor subtypes. As the incorrect folding can occur during the alignment process, the quality of the built homology models was evaluated by Modeller energy function and Ramachandran plots in order to select the best models of $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChRs}$ for molecular docking [29]. The Modeller energy functions that were used to assess the quality of the models were the DOPE score and the GA341 score. DOPE score that reveals the stability of protein conformation was ranked at first. The low DOPE score of models indicated that there are small errors of atomic conformational energy between residues and the model has the high tendency to be the native-like model. Another Modeller energy function to evaluate the model quality is the GA341 score. A GA341 score higher than 0.7 indicates a reliable model, defined by $\geq 95 \%$ probability of a correct fold. The DOPE and GA341 scores of the best $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChR}$ models among 100 homology models of each subtypes are shown in Table 2, which reveals that the protein conformation of these models are stable and they have the correct folding. The overall structure quality of the best model was subjected to the assessment by Ramachandran plots of backbone dihedral angles (phi $(\phi)$ and $\mathrm{psi}(\Psi)$ ) from PROCHECK [30] to view the stereochemical quality of amino acid side chains and highlight regions with unusual geometry. The Ramachandran plots of $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChR}$ homology models are shown in Supplemental Figure S2. There are only few amino acids in disallowed region $(0.5 \%$ and $0.3 \%$ for $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChRs}$, respectively). The amino acids in this area are far away from the binding pocket and have no effect to the binding affinity of ligands. The results of the quality assessment verify the high quality of the generated homology models so that the models appear appropriate as $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChR}$ templates for molecular modeling.

Table 2. Quality assessment of the selected $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChR}$ homology models.

| Selected nAChR Model | Modeller Scoring Function |  | Ramachandran Plot |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | DOPE Score | GA341 Score | Most <br> Favored <br> Region | Additional Allowed Region | Generously Allowed Region | Disallowed Region |
| 人7 | -46,953.29688 | 1 | 92.3 | 6.6 | 0.5 | 0.5 |
| $\alpha 3 \beta 4$ | -46,290.92188 | 0.99998 | 91.1 | 7.6 | 1.0 | 0.3 |

To confirm the validity and reliability of the generated homology $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChR}$ models, firstly, the homology models of $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChRs}$ were superimposed to examine the key amino acid residues in the binding sites of the $\alpha 7$ and $\alpha 3 \beta 4$ subtypes (Figure 2). The overlay of nAChR quaternary structures indicated that all key or conserved residues in an aromatic cage i.e., TyrA93, TrpA149, TyrA188, TyrA195, and TrpB55 (Supplemental Figure S3) [31,32] aligned in the same configuration as shown in Figure 2a,b represent principal and complementary subunits, respectively; the sequence number of amino acid residues were assigned according to the $\alpha 7 \mathrm{nAChR}$. The mentioned amino acid residues are important for ligand binding to form the cation $-\pi$, hydrogen bond, and hydrophobic interactions with nAChR ligands [14]. The critical interaction to modulate nAChR affinity and functionality covers cation- $\pi$ and hydrogen bond interactions between the basic amine of the ligand and the conserved Trp or Tyr residues in the principal subunit [33,34]; these findings support the notion that the selectivity profile of the ligands is likely to be mediated through non-conserved amino acid residues.


Figure 2. The overlay of (a) $\alpha 7$ and $\alpha 3 \beta 4$ nAChR quaternary structures with molecular surface of amino acid residues in an aromatic cage and (b) amino acid residues in an aromatic cage. The amino acid residues are labeled for the $\alpha 7 \mathrm{nAChR}$, whereas the sequence number of residues in the $\alpha 3 \beta 4 \mathrm{nAChR}$ are in a parenthesis. Yellow, $\alpha 7$ nAChR; pink, $\alpha 3$ nAChR; cyan, $\beta 4$ nAChR; red, oxygen; blue, nitrogen.

Secondly, the nAChR subtype-selective ligands, EVP-6124 [16,17] and AT-1001 [20,21] were docked to the homology models. The docked poses of the nAChR subtype-selective ligands, which are the $\alpha 7$-selective EVP-6124 and the $\alpha 3 \beta 4$-selective AT-1001, against the homology models were analyzed to confirm the validity of the prepared homology models (Figure 3, Supplemental Figures S4 and S5). The docked poses of the $\alpha 7$-selective EVP-6124 against the $\alpha 7 \mathrm{nAChR}$ are displayed in Figure 3a. The quinuclidine ring of EVP-6124 has cation $-\pi$ interactions ( $\mathrm{HN}^{+}-\pi$ ) with TrpA149 and TyrA195 and hydrogen bond interaction ( ${ }^{+} \mathrm{NH}-\mathrm{O}=\mathrm{C}$ carbonyl backbone) with TrpA149, the key amino acid residue in the aromatic cage (Figure 3a, Supplemental Figure S4a). In contrary, the EVP-6124 in the AChBP template and the human $\alpha 3 \beta 4 \mathrm{nAChR}$ homology model flipped horizontally, turning the quinuclidine ring in opposite direction, unable to form either hydrogen bond or cation- $\pi$ interactions with TrpA149. For the docked poses of the $\alpha 3 \beta 4$-selective AT-1001 against $\alpha 3 \beta 4 \mathrm{nAChR}$, there are the cation- $\pi$ interactions between the bicyclic granatane motif of AT-1001 and TrpA149 and TyrA197. The H atom of protonated granatane motif has a hydrogen bond interaction with the carbonyl backbone of TrpA149, a key residue (Figure 3b, Supplemental Figure S5). These interactions have not been observed in AChBP, but they have been found in $\alpha 7 \mathrm{nAChR}$ model because the interacting amino acid residues are conserved amino acids. However, the numbers of clusters when docking in $\alpha 7 \mathrm{nAChR}$ are more than $\alpha 3 \beta 4 \mathrm{nAChR}$. The results demonstrate that the nAChR ligands are able to form hydrogen bond and cation- $\pi$ interactions with several amino acid residues; however, the homology models of the nAChR subtypes ( $\alpha 7$ or $\alpha 3 \beta 4 \mathrm{nAChRs}$ ) could better accommodate their corresponding selective ligands and provide interactions with the key conserved amino acid residues. These results confirm the validity of using the constructed $\alpha 7$ and $\alpha 3 \beta 4$ nAChR homology models for molecular docking studies of quinuclidine derivatives.


Figure 3. The docked poses of (a) EVP-6124 (green), an $\alpha 7$-selective nAChR ligand in the human $\alpha 7 \mathrm{nAChR}$ homology model (yellow) and (b) AT-1001 (orange), an $\alpha 3 \beta 4$-selective nAChR ligand in the human $\alpha 3 \beta 4$ nAChR homology model (pink and cyan). The bold letters show amino acids forming hydrogen bond interactions. red, oxygen; blue, nitrogen.

The six enantiomeric pairs of stereospecific compounds, the (R)- and (S)-enantiomers of T1-T6, were then docked with the constructed $\alpha 7$ and $\alpha 3 \beta 4$ nAChR homology models by using AutoDock4.2 [35] to investigate the binding modes and to identify the amino acid residues that governed the selectivity. T1-T6 with $\mathrm{pK}_{\mathrm{a}}$ values of 8.93-8.95 [22] were docked in protonated form that is prevalent to at least $97 \%$ at physiological pH . These six quinuclidine-triazole enantiomeric pairs can be divided into two classes concerning the substituent $R$ (Table 1), i.e., the small substituent pairs (T1-T2) and large substituent pairs including long alkyl side chains and large hydrophobic groups (T3-T6).

However, docking-derived free energies of binding have a limited accuracy that is about $\pm 2 \mathrm{kcal} / \mathrm{mol}$ for AutoDock [36], preventing a discrimination between ( $R$ )- and (S)-enantiomers with $\Delta \mathrm{G}$ values typically within this range (at $37^{\circ} \mathrm{C}, \Delta \mathrm{G}$ values of 2 and $4 \mathrm{kcal} / \mathrm{mol}$ yield Boltzmann-derived eudismic factors of 26 and 661, respectively). Indeed, the differences in computed free energies of binding between the ( $R$ )- and (S)-enantiomers (Supplemental Table S1) show no significant correlation with the experimentally observed variation in nAChR binding affinity. Accordingly, our focus was on identifying potentially relevant interaction modes (hydrogen bond, cation $-\pi, \pi-\pi$, electrostatic salt bridge, and hydrophobic interactions), and how these might depend on the stereochemistry of the ligands. In this way, the purpose of the computational docking was to unravel amino acid determinants and interactions responsible for the observed subtype selectivity.

Generally, the docked poses of the largest conformational cluster (the most populated cluster with the highest \% member) were visually analyzed for key interaction motifs between ligands and amino acid residues in the binding site of nAChRs. In addition to the largest cluster, the second largest cluster and the cluster with the best $\Delta \mathrm{G}$ score were also taken into account. The binding poses of the ligands obtained from molecular docking were related to the in vitro $\alpha 3 \beta 4$ and $\alpha 7$ nAChR binding affinities reported earlier (Table 1) [22].

### 2.2. Binding Modes

The eudismic ratio calculated from in vitro $K_{i}$ values revealed high stereoselective binding. The (S)-enantiomers have 47 - to 327 -fold higher affinity toward the $\alpha 3 \beta 4 \mathrm{nAChR}$ than their $(R)$-counterparts. Rather high ratios of 160-327 were found for the compounds T1-T2 containing a small substituent on the benzene ring (Table 1). Lower eudismic ratios for the $\alpha 7 \mathrm{nAChR}$ ( 1.6 - to 12 -fold) were observed for the $(R)$-enantiomers. With regard to the subtype selectivity ratios of the single enantiomers between the $\alpha 3 \beta 4$ subtype and the $\alpha 7$ subtype, the (S)-enantiomers were found to be selective for the $\alpha 3 \beta 4$ subtype ( 5 - to 294 -fold) while the ( $R$ )-enantiomers were selective for the $\alpha 7$ subtype to a lower extent (3.1- to 33-fold). The more pronounced stereoselectivity of the (S)-enantiomers toward
the $\alpha 3 \beta 4 \mathrm{nAChR}$ than that of the ( $R$ )-enantiomers toward the $\alpha 7 \mathrm{nAChR}$ is likely due to the different subunits comprising the aromatic cage, particularly the complementary $\beta 4$ chain, which is replaced by another $\alpha 7$ subunit in the $\alpha 7$ nAChR. Hence, the molecular dockings of six enantiomeric pairs were performed and the obtained binding modes were extensively investigated to give structural insights (Supplemental Figures S6-S9) into the stereoselective binding of quinuclidine-triazole compounds as detailed below.

### 2.2.1. Binding Modes of ( $S$ )-Enantiomers

The docked ligands or poses in major clusters have been analyzed. All (S)-enantiomers aligned nicely in the binding pocket of $\alpha 3 \beta 4$ nAChRs, which is an aromatic cage located at the interface between the $\alpha 3$ subunit (chain A, principal side) and the $\beta 4$ subunit (chain B, complementary side). For the binding modes of compounds T1-T2 bearing small substituents $(R)$ on the benzene ring, the main components (quinuclidine, triazole, and benzene ring) of ( $R$ )- and ( $S$ )-enantiomers aligned in different orientation (Figure 4a,b). Whereas compounds T3-T6 contain long aliphatic and aromatic R, particularly T5 and T6 (Figure 4c-f), the alignments of these motifs in each enantiomeric pair are in proximity. Comparing the sizes of aromatic cage and the ligands, the small T 1 and T 2 are able to move freely in the aromatic cage and thus may undergo more stabilizing interactions. T1 and T2 have only one cluster ( $100 \%$ of members), while compounds with substituents showing conformational flexibility (T3-T4) have higher numbers of clusters than less flexible ligands (T1-T2, Supplemental Table S1). The docked poses for the compounds containing large substituents (T5-T6) are more similar to their corresponding counterparts than the smaller T1-T2. It is due to the steric hindrance of the additional benzene ring that restricts the ability to conform freely in the binding pocket.

The (S)-enantiomers are able to form hydrogen bond or cation- $\pi$ and $\pi-\pi$ interactions with the conserved amino acid residues in both $\alpha 3$-principal and $\beta 4$-complementary sides of the aromatic cage (Table 3). The interactions between (S)-enantiomers and the amino acid residues in both subunits ( $\alpha 3$ and $\beta 4$ ) indeed stabilize and strengthen the binding resulting in the low affinity values $\left(\mathrm{K}_{\mathrm{i}}=2-19 \mathrm{nM}\right.$, Table 1). Although the $(R)$-enantiomers of compounds T3-T6 were able to interact with AspB173 in the $\beta 4$ complementary subunit, the $\%$ member in the largest clusters and the length of hydrogen bond interactions in the binding modes of compounds $(R)-\mathrm{T} 3$ to $(R)$-T6 were respectively lower and longer than those of the corresponding $(S)$-enantiomers. The orders of magnitude of the in vitro binding affinities appear to be different between the various compounds. It is possibly due to distinct binding poses of each enantiomeric pair (Figure 4). In term of the interacting residues in each subunit (principal subunit compared to the complementary subunit), the ( $S$ )-enantiomers with higher affinity tend to form hydrogen bonds with amino acids in the complementary subunit than the $(R)$-enantiomers (Table 3). The shorter hydrogen bonds (1.65-1.78 A for (S)-enantiomers vs. 1.95-2.08 A for $(R)$-enantiomers) correspond to larger bond strengths, and thus translate into higher ligand-receptor affinities. These findings provide a mechanistic rationale for the experimental outcome that the $\alpha 3 \beta 4$ subtype selectivities of the (S)-enantiomers are 5 to 294 times higher than those of their enantiomeric counterparts (Table 1). Accordingly, the present molecular docking results strongly suggest that the selective $\alpha 3 \beta 4$ binding of the (S)-enantiomers at the C-3 of quinuclidine in quinuclidine-triazole ligands is mediated by interactions with amino acid residues in the complementary face.


Figure 4. The docking poses to $\alpha 3 \beta 4 \mathrm{nAChR}$ of the $(R)$-enantiomers (orange) and the ( $S$ )-enantiomers (green) of T1-T6 (a-f). The amino acid residues forming hydrogen bond, cation- $\pi$, and $\pi-\pi$ interactions are shown. The polar hydrogen atoms of the interacting amino acid side chains are displayed to identify hydrogen bond donors and acceptors. The conserved residues are shown in bold. Pink, $\alpha 3$ nAChR; cyan, $\beta 4 \mathrm{nAChR}$; red, oxygen; blue, nitrogen; orange dashed lines, hydrogen bond interaction with $(R)$-enantiomers; green dashed lines, hydrogen bond interaction with (S)-enantiomers.

### 2.2.2. Binding Modes of (R)-Enantiomers

The binding poses of all enantiomeric pairs located in the binding site of the $\alpha 7 \mathrm{nAChR}$ and the orientations are nearly the same except for compound T2 (Figure 5). Although the triazole ring and the hydrophobic part of all the other enantiomeric pairs are almost superimposable, the quinuclidine ring, particularly the N atom appeared to shift slightly from its counterpart. This might be caused by the rigidity of the triazole linker and the phenyl ring of the hydrophobic part that limit the rotation and conformational freedom of the pose in the binding pocket. Visual analysis of the binding interactions revealed that all enantiomeric pairs are aligned within the aromatic cage and mostly formed interactions with the conserved amino acid residues of the nAChR composed of TyrA93, TrpA149, TyrA188, and TyrA195 in the principal subunit, and of TrpB55 in the complementary subunit (Table 3). These interactions of the $(R)$-enantiomers lead to substantial binding to the $\alpha 7 \mathrm{nAChR}\left(\mathrm{K}_{\mathrm{i}}=22-117 \mathrm{nM}\right)$ but moderate selectivity. The subtype selectivity ratios are 3.1-33 compared to the 5-294 selectivity ratios of the (S)-enantiomers toward the $\alpha 3 \beta 4$ nAChR (Table 1). The $\alpha 7$ nAChR subtype selectivity is low for the ( $R$ )-enantiomers because the interacting residues are the conserved amino acids, available in all nAChR subtypes. The eudismic ratios of the $(R)$-enantiomers over the ( $S$ )-enantiomers toward the $\alpha 7 \mathrm{nAChR}$ are considered to be moderate as well (1.6- to 12 -fold) because the docked poses of each enantiomeric pair share a large common part in the same alignment (triazole ring and hydrophobic part) and thus provide similar binding interactions with the residues in the principal subunit (Figure 5). The only distinct interaction between the $(R)$ - and the ( $S$ )-enantiomers, which has little effect on the $\alpha 7 \mathrm{nAChR}$ binding affinity, is related to hydrogen bond interactions between the triazole ring and a conserved amino acid residue, $\operatorname{TrpB55}$, in the complementary subunit for $(R)$-enantiomers and TyrA188 in the principal subunit for (S)-enantiomers.

Table 3. The amino acid residues involved in the binding interaction to $\alpha 3 \beta 4$ and $\alpha 7 \mathrm{nAChRs}$.

|  |  | $\alpha 3 \beta 4$ nAChR Interaction |  |  |  | $\alpha 7 \mathrm{nAChR}$ Interaction |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Cpd | R | Hydrogen Bond (Distance in $\AA$ ) | Salt Bridge Opportunity | Cation- $\boldsymbol{\pi}$ | $\pi-\pi$ | Hydrogen Bond (Distance in $\AA$ ) | Cation- $\pi$ | $\pi-\pi$ |
| (R)-T1 | $p$-F | TyrA93 (2.45) TyrA197 $(3.02,3.16)$ | - | TrpA149 TyrA197 | - | TrpA149 (1.80) | TrpA149 <br> TyrA195 | TrpB55 |
| (S)-T1 |  | AspB173 (1.78) | AspB173 | - | TrpA149 | TyrA93 (2.30) SerA148 (3.36) | TyrA188 <br> TyrA195 | - |
| (R)-T2 | $m$-F | TyrA93 (3.36) TyrA197 (3.23, 3.36) | - | TyrA190 <br> TyrA197 | - | TyrA93 (2.24) SerA148 (2.82) | TyrA195 | - |
| (S)-T2 |  | AspB173 (1.77) | AspB173 | - | TrpA149 <br> TyrA190 | TyrA93 (2.11) SerA148 (3.22) | TyrA188 <br> TyrA195 | TrpB55 |
| (R)-T3 | $m-\mathrm{O}\left(\mathrm{CH}_{2}\right)_{2} \mathrm{~F}$ | AspB173 (2.05) TyrA190 (2.77) | AspB173 | - | TyrA190 | TrpA149 (1.90) <br> TyrA188 (3.01) | TrpA149 <br> TyrA195 | - |
| (S)-T3 |  | AspB173 (1.78) | AspB173 | - | TrpA149TyrA190 | TrpA149 (1.99) | TrpA149 <br> TyrA195 | TrpA149 <br> TrpB55 |
| (R)-T4 | $m-\mathrm{O}\left(\mathrm{CH}_{2}\right)_{3} \mathrm{~F}$ | AspB173 (2.08) TyrA190 (2.66) | AspB173 | - | TrpA149TyrA190 | TyrA93 (2.18) TrpB55 (2.68, 3.12) | - | TrpA149 |
| (S)-T4 |  | AspB173 (1.70) <br> TrpB59 (3.39) | AspB173 | - | TrpA149 | - | TrpB55 | TrpA149 |
| (R)-T5 | $m$-OBn | AspB173 (1.97) <br> TyrA190 (3.19) | AspB173 | - | TrpA149 | TyrA93 (1.94) TrpB55 (3.01, 3.09) | - | TrpA149 |
| (S)-T5 |  | $\begin{gathered} \text { AspB173 (1.65) } \\ \text { TrpB59 }(3.08,3.22) \end{gathered}$ | AspB173 | - | TrpA149 | $\begin{gathered} \text { TyrA93 (1.85) } \\ \text { TyrA188 }(2.73,3.37) \end{gathered}$ | - | - |
| (R)-T6 | $m-\mathrm{OCH}_{2} \mathrm{C}_{6} \mathrm{H}_{4}-p-\mathrm{F}$ | AspB173 (1.95) TyrA190 (3.15) | AspB173 | - | TrpA149 <br> TyrA190 | $\begin{gathered} \text { TyrA93 }(1.90) \\ \text { TrpB55 }(2.83,3.02) \end{gathered}$ | - | TrpA149 |
| (S)-T6 |  | $\begin{gathered} \text { AspB173 (1.66) } \\ \text { TrpB59 }(3.00,3.18) \end{gathered}$ | AspB173 | - | TrpA149 | $\begin{gathered} \text { TyrA93 (1.96) } \\ \text { TyrA188 }(2.66,3.32) \end{gathered}$ | - | TyrA188 |

[^0] were identified through visual inspection. The conserved amino acid residues are represented in bold.


Figure 5. The docking poses to the $\alpha 7 \mathrm{nAChR}$ of the $(R)$-enantiomers (orange) and the (S)-enantiomers (green) of T1-T6 (a-f). The amino acid residues forming hydrogen bond, cation- $\pi$, and $\pi-\pi$ interactions are shown. The polar hydrogen atoms of the interacting amino acid side chains are displayed to identify hydrogen bond donors and acceptors. The conserved residues are shown in bold. Yellow, $\alpha 7 \mathrm{nAChR}$; red, oxygen; blue, nitrogen; orange dashed lines, hydrogen bond interaction with $(R)$-enantiomers; green dashed lines, hydrogen bond interaction with (S)-enantiomers.

### 2.3. Identification of Amino Acid Determinants and Interactions for the Stereoselective Binding

The different alignment of the binding poses to the $\alpha 3 \beta 4 \mathrm{nAChR}$ between the highly selective (S)-quinuclidine-triazole compounds (47- to 327-fold selective) and its ( $R$ )-counterparts as well as the more favorable binding of single (S)-enantiomers to the $\alpha 3 \beta 4 \mathrm{nAChR}$ over the $\alpha 7 \mathrm{nAChR}$ ( 5 - to 294 -fold more selective) inspired further exploration to identify amino acid residues which are responsible for the selectivity. To identify crucial amino acid residues and interactions, the interacting residues and interactions in the binding modes obtained from molecular docking were visually analyzed.

### 2.3.1. Determinants of Selective $\alpha 3 \beta 4$ Binding

In the comparison of interacting amino acid residues between each ( $R$ )- and (S)-enantiomer against the $\alpha 3 \beta 4 \mathrm{nAChR}$, the (S)-enantiomers provided interactions to both $\alpha 3$ and $\beta 4$ subunits (chain A and chain $B$ ), whereas the $(R)$-enantiomers predominately interacted with the principal $\alpha 3$ subunit. In fact, the small molecules, $(R)-\mathrm{T} 1$ and $(R)$-T2 bind only to the $\alpha 3$ principal subunit. The most common interacting residues of the (S)-enantiomers are the conserved residues, TrpA149 ( $\pi-\pi$ ) and TyrA190 $(\pi-\pi)$ in the principal $\alpha 3$ subunit, and the conserved TrpB59 (hydrogen bond) and the non-conserved AspB173 (hydrogen bond) in the complementary $\beta 4$ subunit (Table 3 ). In all ( $S$ )-enantiomers, the protonated H -atom of N -quinuclidine forms hydrogen bond with an O -atom in the carboxylate side chain of AspB173 within a range of 1.65-1.78 A (Table 3). Notably, (S)-T1 and (S)-T2 exhibited higher affinity and selectivity at the $\alpha 3 \beta 4 \mathrm{nAChR}$ than other $(S)$-enantiomers in the series in spite of less number of interactions. By contrast, the $(R)$-enantiomers showed a respective weaker hydrogen bond (1.95-2.08 $\AA$ ) only for $(R)$-T3-T6. In addition, \% member of docked poses in the largest cluster of (S)-T3 to (S)-T6 were more than those of $(R)$-T3 to (R)-T6, $60-95 \%$ vs. $42-83 \%$ (Supplemental Table S1). Accordingly, (S)-T3 to $(S)$-T6 can better conform to this binding mode that may contribute to the selective binding of (S)-T3 to
(S)-T6 toward $\alpha 3 \beta 4$ nAChR. Therefore, the observed 47- to 327-fold affinity ratio of the (S)-enantiomers to the $\alpha 3 \beta 4$ nAChR over their ( $R$ )-enantiomer counterparts is related to (i) stronger interactions with the complementary $\beta 4$ subunit than with the principal $\alpha 3$ subunit, (ii) the difference in capability for stabilizing interactions with the crucial AspB173, and (iii) \% member in the most populated cluster corresponding to higher fractions of affinity-maximizing conformations. Based on the remarkably high affinity and selectivity of the (S)-enantiomers toward the $\alpha 3 \beta 4$ subtype, it is plausible that the AspB173 determinant might confer an electrostatic salt bridge interaction between quinuclidine $\mathrm{N}^{+}$ and the ionized AspB173 accompanying the hydrogen bond ( ${ }^{+} \mathrm{NH}$ and lone pair electron of one of the two carboxylate groups of AspB173). The salt bridge (Coulomb electrostatic attraction) is stronger than hydrogen bond and cation- $\pi$ interactions; however, salt bridges are not visualized by AutoDock and Molecular Operating Environment (MOE) used in this study. Taken together, the high affinities to the $\alpha 3 \beta 4 \mathrm{nAChR}$ result from the ability to form electrostatic and hydrogen bond interactions with Asp173. Moreover, the eudismic ratios regarding $\alpha 3 \beta 4$ apparently relate also to the higher numbers of suitable (S)-enantiomer conformations in the largest cluster (as expressed by their \% members). For instance, (S)-T1 and (S)-T2 with high eudismic ratios have $100 \%$ member in the largest cluster, whereas the low eudismic ratio of (S)-T3 is accompanied by a significantly lower population of $60 \%$ of the largest cluster. The AspB173 position of the $\alpha 3 \beta 4$ subtype is occupied by the homologous GlyB67 residue of the complimentary $\alpha 7$ subtype. However, GlyB167 has no side chain for a correspondingly stabilizing interaction with the ligand. Hence, the AspB173 residue in the complementary face ( $\beta 4$ ) is considered to be a key determinant residue for the $\alpha 3 \beta 4$-selective binding. In addition to AspB173, the amino acid residue that might also play a role in $\alpha 3 \beta 4$ subtype selectivity is TrpB59. The TrpB59, however, is a conserved amino acid of nAChRs and can be found in other nAChR subtypes as well, e.g., TrpB55 in the $\alpha 7 \mathrm{nAChR}$. Therefore, the role of conserved Trp in complementary subunit could be responsible for affinity and efficacy rather than selectivity.

Moreover, it is interesting to see whether the AspB173 residue in the complementary face ( $\beta 4$ ) is also a determinant residue for an $\alpha 3 \beta 4$-selective binding to other structural scaffolds or chemotypes. To this end, we investigated the binding mode of AT-1001 as selective $\alpha 3 \beta 4$ nAChR ligand featuring a different chemotype (Supplemental Figure S5). The hydrogen bond with AspB173 was not observed in the binding mode of AT-1001. Instead, AT-1001 provided more hydrophobic interactions with other residues in the $\beta 4$ subunit i.e., the non-conserved residues: IleB113, LeuB121, TrpB122, and LeuB123 (Supplemental Figure S5b). AspB173 is therefore not a determinant residue for $\alpha 3 \beta 4$-subtype selectivity concerning other chemotypes. These findings suggest that the $\alpha 3 \beta 4$-subtype selectivity is governed by interactions with residues in the $\beta 4$ subunit, particularly regarding the non-conserved residues. This is in agreement with previous studies showing that non-conserved amino acid residues particularly in the complementary subunit have an important role to mediate the binding affinity. For example, Harpsoe et al. [37] studied the roles of the $\beta 2$ and $\beta 4$ complementary subunits for cytosine and NS3861 binding. They reported that the interactions with the $\alpha$ subunits are important for agonist efficacy, but the weaker interactions with the $\beta$ complementary subunits are responsible for fine tuning of the agonist efficacy. The dominant role of the complementary subunit for the binding affinity was also reported by Parker et al. [38]. Ligands such as epibatidine, acetylcholine, nicotine, and dimethylphenylpiperazinium show higher affinities to the $\beta 2$ than the $\beta 4$ subunit when having $\alpha 2$ as principal subunit. In fact, key determinants for the $\alpha 3 \beta 4$ selective binding have been reported but only for peptide analogs of $\alpha$-conotoxin (RegIIA and mutated LsIA) [39]. Lys61 and Arg113 were the key determinants for RegIIA [40], while Lys57, Ile177, and Ile109 were the key residues for ligand binding in mutated LsIA [41]. The reported determinants are non-conserved amino acid residues in the complementary subunit and are unique for particular chemotypes.

The representative binding modes of compound T2 are displayed in Figure 6. The binding poses of $(S)-\mathrm{T} 2$ and $(R)-\mathrm{T} 2$ for the $\alpha 3 \beta 4 \mathrm{nAChR}$ in Figure 6a appeared to be different, both in the alignment (Figure 6a) and the binding interactions (Table 3). (S)-T2 was able to form hydrogen bond interactions with amino acid residues in the $\beta 4$-complementary subunit that are AspB173 (1.77 $\AA$ )
resulting in the 161 -fold higher affinity of (S)-T2 to $\alpha 3 \beta 4 \mathrm{nAChR}$, whereas $(R)$-T2 was able to form hydrogen bond interactions with amino acid residues in the $\alpha 3$-principal subunit (TyrA93 and TyrA197). (S)-T2 interacted with residues in both subunits of $\alpha 3 \beta 4$ subtype but it mostly interacted with residues in the principal subunit of the $\alpha 7$ subtype only (Figure 6b). These are plausible reasons why (S)-T2 was 294 -fold more active to the $\alpha 3 \beta 4$ subtype than to the $\alpha 7$ subtype.


Figure 6. (a) The docking poses of (R)-T2 (orange) and (S)-T2 (green) showing the interacting residues with the $\alpha 3 \beta 4 \mathrm{nAChR}$ and $(\mathbf{b})$ the overlay between the $(S)$-T2 docking pose in the $\alpha 3 \beta 4$ (green) and the $\alpha 7 \mathrm{nAChR}$ (grey). The amino acid residues in Figure 6a represent the $\alpha 3 \beta 4$ homology model, whereas the amino acid residues in Figure 6b represent the $\alpha 7$ nAChR subunit. The bold letters show amino acids forming hydrogen bond interactions. The polar hydrogen atoms of the amino acid side chains are displayed to identify hydrogen bond donors and acceptors. Pink, $\alpha 3$ nAChR; cyan, $\beta 4$ nAChR; yellow, $\alpha 7$ nAChR; red, oxygen; blue, nitrogen.

To gain insight into the AspB173 determinant engaged in salt bridge formation and to explain the highest binding affinity of compound (S)-T2 toward $\alpha 3 \beta 4 \mathrm{nAChR}$ subtype $\left(\mathrm{K}_{\mathrm{i}}=2.25 \mathrm{nM}\right)$, MD simulation of T 2 , both ( $S$ )- and ( $R$ )-enantiomers with $\alpha 3 \beta 4$ homology model was performed. MD simulation is able to detect the salt bridge formation between the carboxylate of AspB173 determinant and the protonated nitrogen atom of (S)-T2 (Figure 7b), which supports our earlier speculation. When compared with molecular docking, the interacting amino acid residues from MD simulation were mostly the same with some discrepancies in types of interaction due to the flexible and solvated receptor in MD simulation. The conformational flexibility of receptor apparently strengthens the binding affinity by allowing $\alpha 3 \beta 4 \mathrm{nAChR}$ subtype to accommodate and stabilize (S)-T2 into the binding site. The key interactions of (S)-T2 in the $\alpha 3 \beta 4 \mathrm{nAChR}$ binding site are one salt bridge to AspB173, four $\pi-\pi$ stacking interactions (TrpB59 and TyrA93), one hydrogen bond interaction with AlaB42 and one halogen bond (TrpA149) which are more than those of $(R)-\mathrm{T} 2$. The binding mode of (S)-T2 with more interactions both in strength and number explains why (S)-T2 exhibited the highest binding affinity to $\alpha 3 \beta 4 \mathrm{nAChR}$ subtype.
(a)




Figure 7. Molecular dynamics (MD) simulation of (a) (R)-T2 and (b) (S)-T2 with the $\alpha 3 \beta 4 \mathrm{nAChR}$.
For compounds T3-T6 with larger substituents than the fluorine atom on the benzene ring, more interactions were found between the (S)-enantiomers and the residues in the complementary $\beta 4$ subunit (non-conserved AspB173 and the conserved TrpB59). Therefore, the key amino acid residues mediating the $\alpha 3 \beta 4$-selectivity of the quinuclidine-triazole compounds with substituents larger than the fluorine atom are TrpB59 and AspB173. Experimentally mutated amino acid residues for TrpB59 and AspB173 would help to substantiate the determinant role of these residues for $\alpha 3 \beta 4$-subtype selectivity.

### 2.3.2. Determinants of Selective $\alpha 7$ Binding

The selectivity of the (R)-enantiomers for the $\alpha 7$ subtype was not as high as that of the (S)-enantiomers for the $\alpha 3 \beta 4$ subtype. The noticeable enantiomeric selectivity ratios of compounds T2, T5, and T6 to the $\alpha 7$ nAChR (4- to 12-fold more selective) were found to be associated with the binding interactions, predominately with the conserved residues in the principal and complementary subunits. The crucial interactions are likely to be hydrogen bonds with TyrA93 and TrpB55 (Table 3). The interactions via these amino acid residues except $\operatorname{TrpB55}$ are also found in the binding modes of the (S)-enantiomers; therefore, the interacting amino acid residue that mediates the distinct $\alpha 7$ nAChR affinity of this compound series is likely to be TrpB55. Despite the amino acids triggering the $\alpha 7 \mathrm{nAChR}$ selectivity, we have also found out that the interactions driving the $\alpha 7 \mathrm{nAChR}$ affinity of quinuclidine-triazole series might be related to hydrophobic rather than cation- $\pi$ or hydrogen bond interactions as observed in compounds T5-T6 with substituents R larger than the fluorine atom. The additional hydrophobic and $\pi-\pi$ interactions of triazole and benzene rings with TrpA149 in $(R)$-enantiomers of compounds T5-T6 (Table 3) led to higher affinity to the $\alpha 7 \mathrm{nAChR}\left(\mathrm{K}_{\mathrm{i}}=22.5-33.2 \mathrm{nM}\right)$ than $(R)-\mathrm{T} 1$ and $\mathrm{T} 2\left(\mathrm{~K}_{\mathrm{i}}=73-117 \mathrm{nM}\right)$ which have only a small fluoride as substituent.

The representative binding modes of T 5 enantiomers are displayed in Figure 8. The binding poses of the (R)- and (S)-enantiomers for the $\alpha 7 \mathrm{nAChR}$ depicted in Figure 8a are almost in the same orientations, only triazole ring tilts are found which turn the triazole ring to form hydrogen bond interactions with different amino acid residues. This alignment leads to the ability of (R)-T5 to form hydrogen bond interactions with $\operatorname{TrpB55}$ ( 3.01 and $3.09 \AA$ ) and $\operatorname{TyrA93~(1.94~} \AA$ ) as shown in Figure 8 a , which can be observed only in $(R)$-T5 and $(R)$-T6 leading to 12 -fold and 4.5 -fold higher affinity than their (S)-counterparts, respectively. The additional $\pi-\pi$ interaction between the triazole rings and the benzene ring of $\operatorname{TrpA149}$ also helps to stabilize the $\alpha 7 \mathrm{nAChR}$ affinity (Figure S8). This selectivity profile of the $(R)$-enantiomers toward the $\alpha 7$ subtype was not as high as observed for the (S)-enantiomers toward the $\alpha 3 \beta 4 \mathrm{nAChR}$ because most of the binding interactions of $(R)$ - T 5 are related to interactions with conserved amino acid residues. The binding motifs which included hydrogen bond interactions with TyrA93 and TrpB55 together with the additional hydrophobic interactions with
$\operatorname{TrpA149}$, boosted (R)-T5 up to be the most potent $\alpha 7$ nAChR ligand of the series with high selectivity for this subtype.


Figure 8. (a) The overlay docking poses of $(R)$-T5 (orange) and (S)-T5 (green) in the binding site of the $\alpha 7 \mathrm{nAChR}$ and (b) the overlay of $(R)$-T5 docking poses in the $\alpha 7$ (orange) and the $\alpha 3 \beta 4 \mathrm{nAChR}$ (grey).The amino acid residues in Figure 8a represent the $\alpha 7$ homology model, whereas the amino acid residues in Figure 8 b belong to the $\alpha 3 \beta 4 \mathrm{nAChR}$ subunit. The bold letters show amino acids having hydrogen bond interactions. The polar hydrogen atoms of the amino acid side chains are displayed to identify hydrogen bond donors and acceptors. Yellow, $\alpha 7$ subunit; pink, $\alpha 3$ subunit; cyan, $\beta 4$ subunit; red, oxygen; blue, nitrogen.

## 3. Materials and Methods

### 3.1. Protein Template and Ligand Preparations

The amino acid sequences of human $\alpha 7$ and $\alpha 3 \beta 4 \mathrm{nAChRs}$ were downloaded from UniProt for searching a proper protein template from Protein Data Bank (PDB) by Blast protein in Chimera 1.10.2 (Resource for Biocomputing, Visualization, and Informatics at the University of California, San Francisco, CA, USA) [42]. The exclusion criteria was proteins having an antagonist as a ligand. The sequence of the target protein and the template that is the X-ray crystal structure of acetylcholine binding protein (AChBP) in complex with lobeline (PDB ID 5AFH) was aligned by Clustal Omega (Conway Institute, University College Dublin, Dublin, Ireland) [28] and the homology model was generated by Modeller9.15 (University of California San Francisco, San Francisco, CA, USA) [23]. The model quality was evaluated by several parameters i.e., the Discrete Optimized Protein Energy (DOPE) score [43], the GA341 score [29], and the Ramachandran plot [44]. The DOPE score was ranked first. Then, the model was finally selected based on the GA341 score and values from the Ramachandran plot and used as the protein template to study the binding modes of nAChR ligands via molecular docking using AutoDock4.2 program suit (The Scripps Research Institute, San Diego, CA, USA) [35].

The structures of six enantiomeric pairs of nAChR ligands T1-T6 (Figure 1, Table 1) were drawn as protonated forms by ChemDraw Ultra 12.0 (PerkinElmer, Waltham, MA, USA). The MM2 force field was used for energy minimization. Then, Gasteiger charges were added to the ligands and the protein templates and saved as a pdbqt file, a supported format of AutoDock4.2, for the molecular docking study.

### 3.2. Molecular docking

The molecular docking of non-flexible amino acid residues was performed by AutoDock4.2 [35], with genetic algorithm (GA) parameters as described by our previous study [45]. The parameters
included: 100 GA runs, a population size of 150, a maximum of 10,000,000 evaluations, and a maximum of 27,000 generations. The ligand conformations which have similar 3D orientation within $2.0 \AA$ root-mean-square deviation (RMSD) were grouped as conformation clusters. The docked poses in the highest cluster were analyzed for the number of members in the cluster, free binding energies ( $\Delta$ Gbinding), and ligand efficiency (LE) [46]. The binding interaction between ligand and target protein was visually analyzed by AutoDock4.2, PyMOL (Schrödinger, New York, NY, USA) [47] and MOE (Chemical Computing Group, Montreal, Quebec, Canada) [48]. The cation- $\pi$ and $\pi-\pi$ interactions were visualized by the MOE program.

### 3.3. Molecular Dynamics (MD) Simulation

The resulting complexes were optimized by MD simulation using NAMD software (University of Illinois at Urbana-Champaign, Urbana, IL, USA) [49] with CHARMM force field [50]. The complexes were solvated in the TIP3P model water box. The charge of the system was neutralized with appropriate number of counter ions. Initially, the water box was minimized by conjugate gradient method. Prior to the MD simulation, the system was equilibrated for 200 ps using NPT ensemble at 310 K and 1 atm which was controlled by the Nosé-Hoover Langevin piston method [51] with 2 fs time steps and SHAKE algorithm. Periodic boundary conditions (PBC) and Particle Mesh Ewald (PME) method [51] were used for calculation. The production steps, 50 ns of MD simulations were performed with trajectories saving every 2 ns for analysis. The complexes stability was evaluated using root mean square deviation (RMSD) (Supplemental Figure S1). Finally, the complexes were analyzed by BIOVIA Discovery Studio Visualizer 2017 (Biovia, San Diego, CA, USA).

## 4. Conclusions

The molecular docking and MD simulation studies to reveal features accounting for the subtype selective binding of our previous experimental binding studies suggests that the high selectivity profile of (S)-enantiomers of this quinuclidine-triazole series can be attributed primarily to the non-conserved amino acid residues in the complementary subunit comprising the aromatic cage. The key amino acid residue triggering the $\alpha 3 \beta 4 \mathrm{nAChR}$ subtype selectivity is the non-conserved AspB173, whereas the interaction with conserved residues is still necessary for potency. AspB173 can form hydrogen bond and salt bridge interactions with quinuclidine- $\mathrm{NH}^{+}$of the (S)-enantiomers leading to a higher selectivity than their ( $R$ )-enantiomer counterparts. Regarding the $\alpha 7$ subtype, the selectivity profile of the $(R)$-enantiomers is related to interactions with conserved amino acid residues and the homopentameric structure of the $\alpha 7 \mathrm{nAChR}$ subunit. The present findings strongly suggest that the interaction with specific amino acid residues, particularly with the non-conserved residue in the complementary subunit comprising the aromatic cage of the $n A C h R$ binding site, is a key determinant for the $n A C h R$ subtype selectivity. As such, the molecular-level understanding derived from in silico experiment can provide guidance in the design of new compounds with high selectivity profiles to nAChR subtypes.

Supplementary Materials: The following are available online at http://www.mdpi.com/1422-0067/21/17/6189/s1, Figure S1: Root mean square deviation (RMSD) of (a) ( $R$ )-T2 and (b) (S)-T2 with $\alpha 3 \beta 4$ nAChR homology model from the initial conformation performed during molecular dynamics simulations, Figure S2: Ramachandran plot assessments of (a) $\alpha 7$ and (b) $\alpha 3 \beta 4$ nAChR homology models from PROCHECK, Figure S3: The sequence alignment of AChBP from Lymnaea stagnalis (Ls-) and $\alpha 7, \alpha 3$ and $\beta 4$ subtypes of nAChR, Figure S4: The binding interaction of EVP-6124, a reference $\alpha 7 \mathrm{nAChR}$ ligand to (a) $\alpha 7 \mathrm{nAChR}$ and (b) $\alpha 3 \beta 4 \mathrm{nAChR}$, Figure S5: The binding interaction of AT-1001, a reference $\alpha 3 \beta 4$ nAChR ligand to (a) $\alpha 7 \mathrm{nAChR}$ and (b) $\alpha 3 \beta 4$ nAChR, Figure S6: The binding interaction of the (S)-enantiomer of T1-T6 to $\alpha 3 \beta 4$ nAChR, Figure S7: The binding interaction of the $(R)$-enantiomer of T1-T6 to $\alpha 3 \beta 4 \mathrm{nAChR}$, Figure S8: The binding interaction of the $(R)$-enantiomer of T1-T6 to $\alpha 7 \mathrm{nAChR}$, Figure S9: The binding interaction of the (S)-enantiomer of T1-T6 to $\alpha 7$ nAChR, Table S1: The binding energy and ligand efficiency of ligands to $\alpha 3 \beta 4$ and $\alpha 7$ nAChRs.
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[^0]:    The hydrogen bonds were analyzed and measured by AutoDock4.2, the cation- $\pi$ and $\pi-\pi$ interactions were analyzed by Molecular Operating Environment (MOE), and the salt bridges

