# Functional Validation of Virtual Screening for Novel Agents with General Anesthetic Action at Ligand-Gated Ion Channels\*

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**Abbreviations:** ANOVA, one-way analysis of variance; DMSO, dimethyl sulfoxide; EC<sub>10</sub>, effective concentration 10; pLGICs, pentameric ligand-gated ion channels; MD, molecular dynamics; nACh, nicotinic acetylcholine; TM, transmembrane helices;

## **Abstract**

GABA<sub>A</sub> receptors play a crucial role in the actions of general anesthetics. The recently published crystal structure of the general anesthetic propofol bound to GLIC, a bacterial homolog of GABA<sub>A</sub> receptors, provided an opportunity to explore structure-based ligand discovery for pentameric ligand-gated ion channels (pLGICs). We used molecular docking of 153,000 commercially available compounds to identify molecules that interact with the propofol binding site in GLIC. In total, twenty-nine compounds were selected for functional testing on recombinant GLIC and 16 of these compounds modulated GLIC function. Active compounds were also tested on recombinant GABA<sub>A</sub> receptors, and point mutations around the presumed binding pocket were introduced into GLIC and GABA<sub>A</sub> receptors to test for binding specificity. The potency of active compounds was only weakly correlated with properties such as lipophilicity or molecular weight. One compound was found to mimic the actions of propofol on GLIC and GABAA, and to be sensitive to mutations that reduce the action of propofol in both receptors. Mutant receptors also provided insight about the position of the binding sites and the relevance of the receptor's conformation for anesthetic actions. Overall, the findings support the feasibility of the use of virtual screening to discover allosteric modulators of pLGICs, and suggest that GLIC is a valid model system to identify novel GABA<sub>A</sub> receptor ligands.

# Introduction

GABA<sub>A</sub> receptors are targets of many therapeutically important agents. In particular, clinically used general anesthetics including propofol, isoflurane, and midazolam are positive allosteric modulators of most GABA<sub>A</sub> receptors (Garcia et al., 2010). At clinically relevant concentrations, general anesthetics typically increase receptor sensitivity to GABA and thereby prolong inhibition of postsynaptic neuronal excitability (Garcia et al., 2010). However, the precise sites and mechanisms of action of these drugs have not been defined, in part because of the lack of high-resolution structural data for the GABAA receptors. A recent advance in this area has been the discovery of bacterial pentameric ligand-gated ion channels (pLGICs) that are homologous to GABA<sub>A</sub> receptors and may serve as valuable models for structure and function of their human homologs (Tasneem et al., 2005). The validity of prokaryotic pLGICs as models for GABAA receptor structure and function has been supported by sequence homology (Tasneem et al., 2005) and subsequent crystal structures of the ELIC receptor from Erwinia chrysanthemi (Hilf and Dutzler, 2008) and GLIC from Gloeobacter violaceus (Bocquet et al., 2009; Hilf and Dutzler, 2009). These two receptors shared predicted structure properties of pLGICs, including five subunits each containing an extracellular domain and four transmembrane helices (TM1-4) with TM2 facing the ionconducting pore. Although ELIC and GLIC lack the extensive intracellular loop and characteristic extracellular disulfide bridge of GABA<sub>A</sub> receptors, sequence alignments of the TM2 domains show over 60% similarity with eukaryotic pLGICs (Thompson et al., 2012). Similar to GABA<sub>A</sub> receptors, GLIC is modulated by n-alcohols. Indeed, the potency of nalcohols increases with chain-length up to nine carbons (cut-off) for GLIC, which agrees well with the behaviors observed for GABA<sub>A</sub>, glycine and nicotinic acetylcholine (nACh) receptors (Howard et al., 2011). Furthermore, GLIC is modulated by several anesthetics including propofol (Weng et al., 2010), and was recently co-crystalized with propofol and desflurane bound in a lipophilic intra-subunit cavity in the TM domain (Nury et al., 2011). The conservation of this crystallographic binding site in eukaryotic pLGICs was recently supported by photolabeling studies of the *Torpedo marmorata* nACh receptor (Jayakar et al., 2013), indicating this site of action may be a general feature of a variety of receptor family members.

One limitation of high-throughput drug discovery for pLGICs is that functional screening commonly requires time-consuming electrophysiological recordings from transfected cells. The determination of pLGIC structures opens the possibility to use virtual screening of chemical libraries to identify molecules with the ability to modulate the behavior of these channels via allosteric pockets (<u>Jorgensen</u>, 2009). The high cost and the low hit-rates of functional screening methods have further encouraged use of these cheaper and faster computational alternatives. However, the success of molecular docking has been found to vary widely depending on the target protein and algorithm used (Warren et al., 2005), and these approaches remain to be fully validated for targets such as pLGICs. The recently determined crystal structure of GLIC has been used in docking calculations of six general anesthetics to the protein. AutoDock determined several binding sites for the anesthetic agents in the GLIC crystal structure, among them the anesthetic binding site identified through co-crystallography, and the anesthetics' predicted affinities correlated significantly with their known EC<sub>50</sub> values (Liu et al., 2012). Because GLIC is sensitive to several clinically used drugs known to act on GABA<sub>A</sub> receptors, this raised the possibility that compounds acting at this site might modulate GABA<sub>A</sub> receptor function in a similar fashion. In this study, we used molecular docking against the propofol binding site in GLIC to screen more than 150,000 small-sized compounds and select a small number of candidates suitable for electrophysiological testing on GLIC expressed in Xenopus laevis oocytes. We asked whether this approach could identify novel modulators of GLIC, and whether any of these

compounds would also be effective on GABA<sub>A</sub> receptors. We also tested the specificity of active compounds through site-directed mutagenesis of GLIC and GABA<sub>A</sub> receptors. Our results demonstrate that molecular docking screening can be used to discover allosteric modulators of pLGICs and that prokaryotic homologs may be generalized to human members of this receptor family in designing novel pharmaceutical agents.

## **Materials and Methods**

## Preparation of the molecular docking screen

Preparation of the molecular docking screen was carried out in several steps, as described in detail below. First a molecular dynamics (MD) simulation was carried out to obtain coordinates for the phospholipids in the vicinity of the propofol binding site. Second, docking was carried out against 302 snapshots from the MD simulation to identify a structure that was suitable for virtual screening. In the last step, a molecular docking screen of commercially available molecules was carried out against one of these structures.

As the majority of lipids were absent in crystal structures of GLIC, an MD simulation was carried out to obtain conformations of phospholipids in the opening of the propofol binding site. If the membrane was not included in the virtual screening step, molecules would occasionally be docked on the outside the propofol binding cavity. The presence of the membrane constrained the docking search algorithm to the site occupied by propofol, which was hypothesized to be necessary for allosteric modulation of GLIC. For the MD simulations, the crystal structure of GLIC with propofol bound (PDB ID: 3P50) was used for initial coordinates (Nury et al., 2011). The system was embedded into dioleoylphosphatidylcholine lipid bilayer, solvated and ionized as described previously (Murail et al., 2012). The simulation was run in GROMACS 4.5.5 (Hess et al., 2008), using position restraints of 10000 and 1000 kJ/mol/nm<sup>2</sup> on all non-H atoms of propofol and the protein, respectively. The simulation was run with a time step of 2.0 fs and the temperature was controlled to 310 K, applying simulation parameters as in previous work (Murail et al., 2012). Parameters for the protein were taken from the Amber99sb-ILDN force field (Sorin and Pande, 2005), and the Berger force field was used for dioleoylphosphatidylcholine lipids (Berger et al., 1997), combined with TIP3P water (Jorgensen et al., 1983). The ligand atom and bond types were taken from the general Amber Force Field (Duan et al., 2003) and assigned with Antechamber; the Restrained Electrostatic Potential (RESP) point charges were derived from a Density Functional Theory (DFT) calculation as previously described (Murail et al., 2012).

The molecular docking calculations were carried out with the program DOCK3.6 (Irwin et al., 2009; Lorber and Shoichet, 1998; Lorber and Shoichet, 2005). All water molecules and ions were removed from the simulation snapshots. The docking was carried out against one subunit of GLIC and all protein residues within ~20 Å of the propofol binding pocket were explicitly included in the calculations. The phospholipids in the opening of the cavity were kept to favor posing of docked molecules in this pocket. The protonation states of ionizable residues of all Asp, Glu, Arg and Lys residues were set to their charged states. The protonation states of His residues were set by manual inspection of the local hydrogen bonding network. Only His235 was close to the propofol binding pocket and it was protonated on the epsilon-nitrogen. The flexible ligand-sampling algorithm in DOCK3.6 superimposes atoms of the docked molecule onto binding site matching spheres, which indicate putative ligand atom positions (Lorber and Shoichet, 1998; Lorber and Shoichet, 2005). Sixty matching spheres were used and these were based on the atoms of the cocrystallized ligand (propofol). The spheres were also labeled for chemical matching based on the local receptor environment (Shoichet and Kuntz, 1993). The degree of ligand sampling is determined by the bin size, bin size overlap, and distance tolerance. These three parameters were set to 0.3 Å, 0.1 Å, and 1.4 Å, respectively, for both the binding site matching spheres and the docked molecules. For ligand conformations passing an initial steric filter, a physicsbased scoring function was used to evaluate the fit to the binding site. For the best scoring conformation of each docked molecule, 100 steps of rigid-body minimization were carried out (Lorber and Shoichet, 1998; Lorber and Shoichet, 2005). The score for each conformation was calculated as the sum of the receptor-ligand electrostatic and van der Waals interaction energy, corrected for ligand desolvation (Shoichet et al., 1999) These three terms are evaluated from pre-calculated grids. The three-dimensional map of the electrostatic potential in the binding site was prepared using the program Delphi (Nicholls and Honig, 1991). In this calculation, partial charges from the united atom AMBER force field (Weiner et al., 1984) were used for all receptor atoms except the side chain hydroxyls of Y254 and T255, for which the dipole moment was increased by +0.4 on the polar hydrogens and decreased by -0.4 on the oxygens to favor hydrogen bonding to these residues as described previously (Carlsson et al., 2010). The program CHEMGRID was used to generate a van der Waals grid, which is based on a united atom version of the AMBER force field (Meng et al., 1992). The desolvation penalty for a ligand conformation is estimated from a pre-calculated transfer free energy of the molecule between solvents of dielectrics 78 and 2. The docked molecules were assumed to be completely desolvated upon binding to the propofol binding pocket (Shoichet et al., 1999). Prior to the DOCK3.6 calculation, each molecule was prepared for docking by pre-generating up to 600 conformations using the program OMEGA (OpenEye Scientific Software, Santa Fe, NM). Partial atomic charges and transfer free energies for each molecule were calculated using AMSOL (Chambers et al., 1996; Li et al., 1998) and van der Waals parameters were derived from an all-atom AMBER potential (Weiner et al., 1986).

The molecular docking screen was carried out in two steps. Docking was first carried out against 302 snapshots from the MD simulation. In this step, two criteria were used to identify a structure (of the protein and membrane) that was suitable for virtual screening. For each MD snapshot, the ability of the snapshots to identify propofol among a set of decoys (non-binders) and to reproduce the binding mode of propofol were assessed. As few experimentally verified non-binders were available, 100 molecules with similar chemical properties but different chemical structures were selected as decoys according to the DUDE protocol (Mysinger et al., 2012). Propofol and the 100 decoys were docked to each of the 302

structures and were ranked based on their predicted energy scores. The ten MD snapshots with the best abilities to identify propofol among the decoys were analyzed visually. From these, a snapshot that both reproduced the binding mode of propfol and had phospholipids that tightly enclosed the binding pocket was selected for the screening of commercially available compounds. All molecules with 13 or fewer non-H atoms in the ZINC fragment-like library (Irwin et al., 2012) (Mw < 250, LogP < 3.5, and rotatable bonds < 5) were screened against the selected MD snapshot. In total, 153,000 compounds were docked and ranked based on their predicted binding energy.

## **Oocyte Preparation**

Oocytes from female *Xenopus laevis* frogs were extracted, isolated and stored as described previously (Howard et al., 2011; McCracken et al., 2010). For the expression of GLIC, 32 nl cDNA solution was injected into the oocyte nucleus via the animal pole using a microdispenser (Drummond Scientific, Broomall, PA) with a 20–30 μm outer diameter glass capillary tip pulled with a Flaming/Brown Micropipette Puller (Sutter Instrument Co., Novato, CA). We used 1 ng GLIC wild-type cDNA, 9 ng GLIC M205W cDNA, and 3 ng of all other GLIC mutant cDNA per oocyte. For the expression of GABA<sub>A</sub> receptors, cRNA encoding wild-type or mutant α1, β2, and γ2s subunits in a 1:1:3 ng ratio was injected into the oocyte cytoplasm. The capped cRNA encoding GABA<sub>A</sub> receptor subunits was made using mMessage mMachine (Life Technologies, Grand Island, NY). After injection, oocytes were incubated individually in 96-well plates filled with incubation media consisting of 88 mM NaCl, 10 mM HEPES, 2.4 mM NaHCO<sub>3</sub>, 1 mM KCl, 0.91 mM CaCl<sub>2</sub>, 0.82 mM MgSO<sub>4</sub>, 0.33 mM Ca(NO<sub>3</sub>)<sub>2</sub>, 2 mM sodium pyruvate, 0.5 mM theophylline, 0.1 mM gentamicin, 17 μM streptomycin and 10,000 U/l penicillin. Oocytes expressing GABA<sub>A</sub> receptors were incubated for 2–5 days, while GLIC-expressing oocytes were stored until the signal reached

between -0.8 and  $-20~\mu A$  when activated with an EC<sub>10</sub> (concentration at which the channels conduct 10% of their maximal currents) of protons. An exception was made for GLIC M205W mutants, where we accepted signals as low as  $-0.3~\mu A$ .

Changes in current as a response to receptor activation were measured by two electrode voltage clamp (TEVC) electrophysiology (Wagner, 2000). During recordings, each oocyte was kept in a ~100 µl perfusion chamber connected to a peristaltic pump (Cole-Palmer, Vernon Hills, IL) flowing at 2 ml/min via 18-gauge inert tubing. Expressing oocytes were clamped at –70 mV using an oocyte clamp (Warner Instruments, Hamden, CT), and continuously recorded using a digitizer controlled by LabChart Pro software (AD Instruments, Colorado Springs, CO).

#### **Oocyte Recordings**

As the effect of allosteric modulators on pLGICs has been shown to be greater at lower levels of activation, we used an activating concentration of protons (GLIC) or GABA (GABA<sub>A</sub> receptors) of EC<sub>10</sub>. As mutations introduced to a channel can alter its sensitivity to protons, agonist response curves for each GLIC mutant were fit to find its EC<sub>10</sub>. Activation buffer for GLIC experiments consisted of 123 mM NaCl, 10 mM sodium citrate, 2 mM KCl, 2 mM MgSO<sub>4</sub> and 2 mM CaCl<sub>2</sub>, adjusted to each channel's EC<sub>10</sub> pH. GLIC running buffer was identical to activation buffer, but with 10 mM HEPES in place of citrate; the pH was adjusted either to pH 8.0 for GLIC I201F and I202W/I258W, or to pH 7.4 for all other clones. Experimental buffers for GABA<sub>A</sub> receptor experiments consisted of 96 mM NaCl, 2 mM KCl, 1 mM CaCl<sub>2</sub>, 1 mM MgCl<sub>2</sub>, and 5 mM HEPES adjusted to pH 7.5. In GABA<sub>A</sub> receptor experiments, the EC<sub>10</sub> GABA concentration was determined for each oocyte after application of a maximal GABA concentration. Propofol and all novel compounds were prepared as 50–100 mM stocks in dimethyl sulfoxide (DMSO). Less than two hours before use, stock solutions were diluted to the appropriate concentration in running or activation

buffer and sonicated in an Ultrasonic Cleaner Model 450, E/MC (RAI Research, Long Island, NY) for at least 2 min prior to application.

To measure each drug response, wild-type or mutant receptors were first activated for 2 min (GLIC) or 30 s (GABA<sub>A</sub> receptors) with EC<sub>10</sub> activation buffer (containing the appropriate concentration of protons or GABA, respectively), followed by a 5–15 min washout with running buffer. Then, the test compound was pre-applied in running buffer for 1 min. Immediately after pre-application, compound was co-applied with activation buffer for 2 min (GLIC) or 30 s (GABA<sub>A</sub> receptors), followed by another 5–15 min washout. Finally, activation buffer was applied again for 2 min (GLIC) or 30 s (GABA<sub>A</sub> receptors). Percent modulation was calculated as the ratio of the peak co-application current to the average of the initial and final activations in the absence of compound.

## **Statistics**

Prism 6.0 (GraphPad Software, La Jolla, CA) was used for statistical analysis of all data. Pooled data were calculated as value means  $\pm$  s.e.m. Initial validation was performed using one-way analysis of variance (ANOVA) to determine the significant differences between each compound and vehicle (0.1% DMSO). All other statistical analyses were performed using either a Student's t-test, one-way ANOVA or two-way ANOVA, as indicated.

#### Mutagenesis

We used molecular visualization in UCSF Chimera 1.6.1 (Pettersen et al., 2004) to choose amino acids in the GLIC-propofol co-crystal structure (Nury et al., 2011) that would most likely block propofol binding if mutated to phenylalanine or tryptophan. For mutagenesis of both GLIC and GABA<sub>A</sub> receptors, we used commercially made mutagenic primers (Integrated DNA Technologies, Coralville, IA) and the QuikChange II site-directed mutagenesis kit (Agilent Technologies, Santa Clara, CA).

# **Results**

## Molecular docking screen and compound selection

The molecular docking screen was carried out against the structure of GLIC that has propofol bound to an allosteric, intra-subunit TM site (PDB ID: 3P50). The binding pocket is completely occluded from aqueous solvent but accessible from the lipid membrane (Figure 1).

In the first step, propofol was (re)docked to the intra-subunit pocket. Docking algorithms have largely been developed for soluble proteins, creating two challenges in these initial membrane-embedded screens. First, because the phospholipids surrounding the binding site were not resolved in the crystal structure, the docking algorithm occasionally produced ligand orientations outside the intra-subunit pocket. Second, as the region surrounding the intra-subunit pocket was treated as a medium with a dielectic representative of aqueous solution, polar groups of docked molecules were sometimes positioned towards the membrane. To achieve a more physically correct description of ligand binding to the pocket, an MD simulation of GLIC with propofol bound was carried out in a hydrated lipidbilayer. In the simulation, GLIC and propofol were tightly restrained to their initial coordinates while the membrane and solvent were allowed to equilibrate for 25 ns. A snapshot of the equilibrated membrane, which shows the location of the propofol binding pocket, is shown in Supplemental Figure 1. From this simulation, 302 snapshots of GLIC with equilibrated phospholipids surrounding the intra-subunit pocket were extracted. Propofol together with 100 decoys (non-binders) were then docked to each structure using DOCK3.6. One of the MD snapshots that had the best ability to identify propofol among the decoys was chosen for the prospective virtual screen. For this structure, propofol was ranked as number 17 of the 101 docked molecules.

Over 153,000 commercially available molecules from the ZINC fragment-like library were docked to the intra-subunit pocket of GLIC. The 700 top-ranked compounds, corresponding to 0.5% of the screened library, were inspected for properties that are not taken into account in the docking scoring function, such as similarity to known ligands, availability from vendors, and physical properties. In total, twenty-two compounds among the top-ranked molecules were selected for experimental testing (Supplemental Table 1). A majority of the compounds had a six-membered aromatic ring, but varied in the composition, polarity, and number of substituents.

## **Functional Validation of Molecular docking screen**

We divided the experimental testing of the predicted ligands into three phases. First, we asked whether molecular docking could provide novel ligands that modulate GLIC. Second, we mutated amino acids critical for propofol action on GLIC to answer whether the screened compounds bind specifically to the site targeted by computational docking. Third, we asked if novel GLIC modulators also altered the function of GABA<sub>A</sub> receptors, and if these effects were specific to the GABA<sub>A</sub> receptor propofol site.

To test the ability of virtual screening to find compounds that modulate GLIC function, the 22 compounds that were selected from the docking screen (Supplemental Table 1) were tested at 50  $\mu$ M for their ability to alter proton-activated GLIC currents (pH 5.5, ~EC<sub>10</sub>) and compared to vehicle (0.1% DMSO) by ANOVA (Figure 2). The concentration of 50  $\mu$ M is within the range reported to be lethal in 50% of the subjects (30-100  $\mu$ M, Krasowski et al., 2001) but it produced a non-maximal effect on GLIC, which is not as sensitive as the GABA<sub>A</sub> receptors. A total of 13 compounds (59%) were positive hits, defined by significantly stronger inhibition than vehicle (p-value  $\leq$  0.05) and are shown in Table 1. Five of the most significant hits (p-value  $\leq$  0.0001) were unbranched disubstituted benzenes and, similar to many anesthetics, these compounds were all halogenated. Three of the

strongest inhibitors, compounds 2–4, were distinguished only by the position of the methyl group on the benzene ring (ortho, meta, and para, respectively). The para-substituted compounds, 4 and 11, led to the greatest inhibition, but all potencies were within  $\pm$  15% of the propofol response.

To further investigate the structure-activity relationship for the discovered ligands, seven additional analogs were purchased (23-29, Supplemental Table 2). A potential concern with screening molecules containing alkylhalide moieties is that such compounds may be reactive and be a source of false-positives in high-throughput screening (Rishton, 1977). To verify that compounds 2, 3, 4, and 20 were not acting via such a mechanism, analog 23 was tested against GLIC. In compound 23, the methyl and ethylbromide substituents of compound 4 were replaced with a bromo and propyl group, respectively, and these rearrangements only changed the extent of GLIC modulation slightly. Analogs of compounds 7 and 11 were also tested. Two of the purchased analogs of compound 11, 24 and 26, were still active, but the inhibition was reduced by ~10% and 30%, respectively. The rather small change of the thioether in compound 11 to an ether moiety in compound 25 decreased inhibition by 50%, producing an effect not significantly different from vehicle (Supplemental Table 1). Only one out of five tested pyrazole compounds led to a significant inhibition of activation. The presence of a methyl rather than an amine group in active compound 7 vs. inactive compound 10 (Supplemental Table 1) increased inhibition by 30%. Similarly, replacing the bromine in compound 7 with a hydrogen in compound 28 also led to a significant reduction of activity. None of the three analogs of compound 7 (27-29, Supplemental Table 2) modulated GLIC to a significantly greater extent than vehicle. Considering all 29 tested compounds, a total of 16 (55%) produced a significant inhibition compared with vehicle (p-value  $\leq 0.05$ ). The predicted binding modes for compounds 4 and 7 in the GLIC crystal structure are shown in Figure 3.

Multiple studies have shown that the potency of anesthetics correlates with simple physicochemical properties. For this reason, we next asked if the physicochemical properties of the discovered compounds correlated with differences in GLIC modulation. The extent of modulation was plotted against the partition coefficient (logP, Figure 4A) and molecular weight of each compound (Figure 4B). Among the compounds tested, potency did not correlate with lipophilicity ( $R^2$ = 0.24) or molecular weight ( $R^2$ = 0.04).

## **GLIC Binding Site Specificity**

In the second part of the validation process, we explored whether virtual screening yielded compounds that bound to the same site as propofol on GLIC. We tested a series of mutations in the propofol binding pocket for reduced propofol inhibition, as such mutations should also block novel compounds from binding if they modulate the GLIC via the same site and mechanism (Figure 5A). Mutation of leucine to tryptophan at position 206 in TM1 reduced apparent propofol binding, as propofol modulation was drastically reduced over a wide concentration range (Figure 5B). Conversely, propofol inhibition of GLIC mutants I201F, Y245F, I258W, and the double mutant I202W/I258W followed sigmoidal concentration dependence with inhibitory concentration 50 (IC<sub>50</sub>) values similar to wild-type GLIC. An interesting effect was observed in the M205W mutant, for which low concentrations of propofol (1 to 50 µM) potentiated proton activation, while higher concentrations (100 µM and higher) inhibited channel function. When tested in the M205W mutant, six of the hit compounds (3, 4, 7, 11, 15, and 17) produced an inhibitory modulation that did not show significant differences compared to wild-type (Figure 6A). Due to its apparent influence on propofol binding, the L206W mutant was tested with the same hit compounds plus 22. Inhibition by compound 7 was markedly reduced for L206W compared to wild-type GLIC (Figure 6B).

### Modulation of GABA<sub>A</sub> receptors

The sedative and anesthetic actions of propofol have been attributed primarily to modulation of GABA<sub>A</sub> receptors (Garcia et al., 2010; Jurd et al., 2003). Therefore, we asked if compounds which modulated GLIC would also allosterically modulate recombinant  $\alpha 1\beta 2\gamma 2$  GABA<sub>A</sub> receptors. We tested these compounds on a submaximal GABA concentration (EC<sub>10</sub>) at a concentration of 2  $\mu$ M, and compared them with propofol at the same concentration. Propofol produced a potentiation of 137% (n=4), while the rest of the compounds had minimal effects (-2 to 6%, data not shown). We then tested propofol and the other compounds at the concentration (50  $\mu$ M) used on GLIC, to be able to measure and compare all effects. At 50  $\mu$ M, propofol potentiated  $\alpha 1\beta 2\gamma 2$  GABA<sub>A</sub> receptors activated by EC<sub>10</sub> GABA ~11-fold (Figure 7A). Compounds 7 and 22 also produced substantial potentiation of GABA responses, enhancing currents ~0.5- and ~2-fold at 50  $\mu$ M, respectively. The effect of compound 7 was concentration-dependent, increasing to ~1.5-fold potentiation at 100  $\mu$ M (data not shown). Most of the other novel compounds produced a small potentiation between 3% and 29% (Figure 7A).

Mutations at residue 265 in TM2 of the GABA<sub>A</sub> receptor  $\beta$  subunit have been previously shown to reduce actions of propofol (Jurd et al., 2003). We confirmed that  $\beta$ 2(N265I) reduced the effects of 50  $\mu$ M propofol (Figure 7B), and asked if this mutation would also reduce the effects of our most potent novel compounds. For both compounds 7 and 22, the  $\beta$ 2(N265I) mutation caused a significant decrease in potentiation, similar to that of propofol (Figure 7B).

We considered the possibility that the compounds that did not have effect per se could be binding to the same site as propofol without producing any effect. If that were the case,

they could act as competitive antagonists and block propofol effects. When fourteen compounds (50  $\mu$ M) were individually co-applied with propofol (2  $\mu$ M), most did not have any effect and six showed only a very small antagonistic effect on propofol potentiation, even with a concentration 25 times higher (Supplemental Figure 2). Thus, none of the fourteen compounds appeared to have clear antagonistic effects.

## Discussion

The aim of this study was to investigate whether high-resolution crystal structures could be used to identify novel modulators of pLGICs. Docking against the crystallographic propofol binding pocket, as recently demonstrated by other groups (Liu et al., 2012), revealed challenges in targeting allosteric sites of membrane proteins with virtual screening approaches. A combined MD and molecular docking approach enabled us to explicitly account for interactions of potential ligands with both the protein and surrounding membrane environment. With this protocol, it was possible to build on previous docking studies (Liu et al., 2012) to carry out a screen of commercially available chemicals for those that complemented the propofol binding pocket of GLIC. Of the 29 compounds selected for functional testing on GLIC, 55% showed significantly higher inhibition than vehicle, including three compounds (10%) which produced equal or greater modulation than propofol. This hit-rate compares favorably with previous virtual screening studies against membrane receptors. For example, virtual screens against the dopamine D<sub>3</sub> receptor (Carlsson et al., 2011) and adenosine A<sub>2A</sub> receptor (Carlsson et al., 2010) crystal structures produced hit rates of 23% and 35%, respectively. As in the case of these GPCRs, the deep and enclosed intrasubunit pocket of GLIC is likely to interact favorably with many small organic compounds.

The level of activity of the hit compounds did not correlate with simple physicochemical properties, supporting that these allosteric modulators act via specific interactions with GLIC rather than changing the properties of the membrane as was historically suggested for anesthetics (McCreery and Hunt, 1978). Because of the small size of the site, compounds that were selected for virtual screening were restricted to molecules with less or equal to 13 or fewer non-H atoms; with this restriction, functional experiments on GLIC revealed no correlation between potency and molecular weight. Similarly, while all compounds identified

by virtual screening fell in a logP range of 2.2 to 4.0, the potency of compounds in this range did not depend purely on lipophilicity, as the correlation between modulation and logP was low.

Given that physicochemical properties did not explain differences in GLIC modulation, we examined possible associations between potency and structural features. Several structural classes were capable of inhibiting GLIC activation. Identification of a single pharmacophore for modulation was not possible, but two-thirds of the compounds with disubstituted benzenes showed significant modulation. It should be noted that a majority of all discovered ligands were halogenated, which is also a characteristic of many anesthetics, particularly volatile agents as desflurane. Among the 12 most potent hit compounds (*p*-value  $\leq 0.0001$  in Figure 2), nine share the feature of an aromatic ring structure connected to an unbranched side chain with at least three non-H atoms. However, the position of the side chains seems to be of marginal importance for methylbenzenes, as compounds 2, 3, and 4 all led to high inhibition. Intriguingly, even minor structural differences in the longer side chain led to differences in potency.

We used mutagenesis around the presumed propofol binding site in GLIC to test the specificity of hit compounds for the site targeted by virtual screening. One mutation, L206W, strongly reduced propofol inhibition, and also inhibited the action of one of the seven compounds that we tested (compound 7). Notably, this L206W-sensitive compound was ranked among the top ten molecules in the docking screen of over 150,000 compounds against the GLIC crystal structure. It was also an effective potentiator of GABA<sub>A</sub> receptors, and its modulation appeared to be specifically decreased by the propofol-blocking GABA<sub>A</sub> receptor mutation β2(N265I). These findings are consistent with the presence of a conserved binding site for propofol and compound 7 in GLIC and GABA<sub>A</sub> receptors. Compared to propofol, compound 7 is less lipophilic, and could be valuable as a chemical tool for further

understanding of pLGIC. Conversely, most of the active compounds from the docking screen were not significantly affected by the L206W mutation. This result could suggest that many of our discovered ligands do not bind at the same site as propofol, and that the true docking hit-rate – the percent of the tested compounds that actually target the intra-subunit pocket – is lower than 55%. However, it is also possible that these compounds, as well as propofol, act via multiple sites, particularly given their small size and amphiphilic nature. It may also be that our model of anesthetic binding based on the GLIC crystal structure is imperfect, particularly given that this structure represents a presumed open state (Nury et al., 2011) that may differ dramatically from the conformation stabilized by allosteric inhibitors.

The M205W mutation was unique in that propofol acted as a potentiator at lower concentrations, but turned into an inhibitor at concentrations 100 µM and higher. These results could reflect a change in the functional outcome of binding, such that the targeted cavity is converted from an inhibitory into a potentiating site; however, this hypothesis does not easily explain why propofol acts as an inhibitor at higher concentrations. Alternately, the M205W mutation could create or favor a second binding site, at which propofol acts to enhance function. This two-site hypothesis was recently supported by work with *n*-alcohols (Howard et al., 2011), where mutations that altered the potentiating effects of short-chain alcohols on GLIC did not affect inhibition by long-chain alcohols, which suggests that they bind in a distinct site. Indeed, recent co-crystal structures with the volatile anesthetic bromoform associated binding in a novel inter-subunit cavity with GLIC potentiation, whereas channels inhibited by bromoform showed only binding in the intra-subunit cavity (Sauguet et al., 2013). Our virtual screening hit compound 7 appears to bind more specifically to the inhibitory binding site than propofol, as it was not affected by the potentiation-enhancing M205W mutation.

A third hypothesis is that propofol binding to the crystallographic site is actually not the important mechanism for channel inhibition. Interestingly, the four residues in closest proximity to the crystallographic propofol binding site in GLIC showed almost no effect on propofol modulation when mutated. However, tryptophan substitutions at M205 and L206, which are located deeper within the subunit than most of the predicted binding site residues, led to a significantly different propofol response than in wild-type. These data suggest that propofol may bind deeper within the channel than predicted in the crystal structure, and/or may bind in multiple sites as suggested above. Indeed, recent MD studies have suggested a variety of alternative sites of anesthetics binding to pLGICs, including inter-subunit cavities (Bondarenko et al., 2013; Spurny et al., 2013) and the channel pore (LeBard et al., 2012). This distinction may reflect the determination of the GLIC crystal structure with propofol in a presumed open state, whereas it is assumed that the inhibitory action of propofol stabilizes the closed state (Nury et al., 2011). Our data suggest that the functionally relevant inhibitory site for propofol may be more deeply buried in the intra-subunit cavity than indicated in the crystal structure.

Many of our hit compounds proved to modulate GABA<sub>A</sub> receptors in addition to GLIC, although none approached the high potency and effectiveness of propofol, and effects on behavioral pharmacology phenotypes such as loss of righting reflex are beyond the scope of this study. On one hand, the identification of GABA<sub>A</sub> modulators by virtual screening of GLIC suggests that these receptors share a conserved binding site for anesthetics. On the other hand, the low potency of these compounds indicates that the binding sites are different enough for virtual screening to select compounds that bind much more specifically to GLIC than to GABA<sub>A</sub> receptors. Although studies of the *Torpedo* nACh receptor have supported conservation of the crystallographic intra-subunit propofol site from GLIC in eukaryotic receptors (Jayakar et al., 2013), previous studies suggested a neighboring inter-subunit site

for propofol potentiation of GABA<sub>A</sub> receptors (<u>Chiara et al., 2012</u>). Our identification of hit compounds for GABA<sub>A</sub> receptors suggests the binding sites for propofol on both channels are similar; however, it remains plausible that the precise binding site on GABA<sub>A</sub> receptors differs from that on GLIC (<u>Chiara et al., 2012</u>), or that multiple sites of action contribute to the net pharmacological profile (<u>Murail et al., 2012</u>). In either case, identification of novel anesthetics will be facilitated by new GABA<sub>A</sub> receptor homology models; our results suggest that the GLIC structure is a valid starting point for such modeling.

In this study, we demonstrate that computational screening of commercially available chemical libraries is capable of prioritizing candidates for new allosteric modulators of GLIC with a high hit-rate, and of identifying novel compounds with propofol-like actions on GABA<sub>A</sub> receptors. In addition, our mutational studies on GLIC suggest the presence of a propofol site slightly deeper within the channel than suggested by the crystal structure. In summary, these findings emphasize the value of combining mutational, functional and crystallographic data in understanding structure and function of brain receptors, and in the development of better methods for drug discovery. In particular, the high hit-rate of our approach in finding new ligands for GLIC, along with our more limited success with GABA<sub>A</sub> receptors, emphasizes the need for better GABA<sub>A</sub> receptor models in the search for new anesthetics.

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**Authorship Contributions** 

Participated in research design: Lindahl, Harris and Carlsson

Conducted experiments: Heusser, Howard, Borghese, Cullins, Broemstrup, Lee, Lindahl and

Carlsson

Performed data analysis: Heusser, Howard, Borghese, Cullins, Broemstrup and Lee

Wrote or contributed to the writing of the manuscript: Heusser, Howard, Borghese, Lindahl,

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#### References

- Berger O, Edholm O and Jahnig F (1997) Molecular dynamics simulations of a fluid bilayer of dipalmitoylphosphatidylcholine at full hydration, constant pressure, and constant temperature. *Biophysical journal* **72**(5): 2002-2013.
- Bocquet N, Nury H, Baaden M, Le Poupon C, Changeux JP, Delarue M and Corringer PJ (2009) X-ray structure of a pentameric ligand-gated ion channel in an apparently open conformation. *Nature* **457**(7225): 111-114.
- Bondarenko V, Mowrey D, Liu LT, Xu Y and Tang P (2013) NMR resolved multiple anesthetic binding sites in the TM domains of the α4β2 nAChR. *Biochimica et biophysica acta* **1828**(2): 398-404.
- Carlsson J, Coleman RG, Setola V, Irwin JJ, Fan H, Schlessinger A, Sali A, Roth BL and Shoichet BK (2011) Ligand discovery from a dopamine D3 receptor homology model and crystal structure. *Nat Chem Biol* **7**(11): 769-778.
- Carlsson J, Yoo L, Gao ZG, Irwin JJ, Shoichet BK and Jacobson KA (2010) Structure-based discovery of A2A adenosine receptor ligands. *J Med Chem* **53**(9): 3748-3755.
- Chambers CC, Hawkins GD, Cramer CJ and Truhlar DG (1996) Model for Aqueous Solvation Based on Class IV Atomic Charges and First Solvation Shell Effects. *The Journal of Physical Chemistry* **100**(40): 16385-16398.
- Chiara DC, Dostalova Z, Jayakar SS, Zhou X, Miller KW and Cohen JB (2012) Mapping general anesthetic binding site(s) in human α1β3 gamma-aminobutyric acid type A receptors with [(3)H]TDBzl-etomidate, a photoreactive etomidate analogue.

  Biochemistry 51(4): 836-847.
- Duan Y, Wu C, Chowdhury S, Lee MC, Xiong G, Zhang W, Yang R, Cieplak P, Luo R, Lee T, Caldwell J, Wang J and Kollman P (2003) A point-charge force field for molecular

- mechanics simulations of proteins based on condensed-phase quantum mechanical calculations. *Journal of computational chemistry* **24**(16): 1999-2012.
- Garcia PS, Kolesky SE and Jenkins A (2010) General anesthetic actions on GABA(A) receptors. *Curr Neuropharmacol* **8**(1): 2-9.
- Hess B, Kutzner C, van der Spoel D and Lindahl E (2008) GROMACS 4: Algorithms for Highly Efficient, Load-Balanced, and Scalable Molecular Simulation. *Journal of Chemical Theory and Computation* **4**(3): 435-447.
- Hilf RJ and Dutzler R (2009) Structure of a potentially open state of a proton-activated pentameric ligand-gated ion channel. *Nature* **457**(7225): 115-118.
- Hilf RJC and Dutzler R (2008) X-ray structure of a prokaryotic pentameric ligand-gated ion channel. *Nature* **452**(7185): 375-379.
- Howard RJ, Murail S, Ondricek KE, Corringer PJ, Lindahl E, Trudell JR and Harris RA (2011) Structural basis for alcohol modulation of a pentameric ligand-gated ion channel. *Proc Natl Acad Sci U S A* **108**(29): 12149-12154.
- Irwin JJ, Shoichet BK, Mysinger MM, Huang N, Colizzi F, Wassam P and Cao Y (2009)

  Automated docking screens: a feasibility study. *J Med Chem* **52**(18): 5712-5720.
- Irwin JJ, Sterling T, Mysinger MM, Bolstad ES and Coleman RG (2012) ZINC: A Free Tool to Discover Chemistry for Biology. *Journal of chemical information and modeling*.
- Jayakar SS, Dailey WP, Eckenhoff RG and Cohen JB (2013) Identification of propofol binding sites in a nicotinic acetylcholine receptor with a photoreactive propofol analog. *The Journal of biological chemistry* **288**(9): 6178-6189.
- Jorgensen WL (2009) Efficient drug lead discovery and optimization. *Accounts of chemical research* **42**(6): 724-733.
- Jorgensen WL, Chandrasekhar J, Madura JD, Impey RW and Klein ML (1983) Comparison of simple potential functions for simulating liquid water. *J Chem Phys* **79**(2): 926.

- Jurd R, Arras M, Lambert S, Drexler B, Siegwart R, Crestani F, Zaugg M, Vogt KE, Ledermann B, Antkowiak B and Rudolph U (2003) General anesthetic actions in vivo strongly attenuated by a point mutation in the GABA(A) receptor β3 subunit. *Faseb J* 17(2): 250-252.
- Krasowski MD, Jenkins A, Flood P, Kung AY, Hopfinger AJ and Harrison NL (2001)

  General anesthetic potencies of a series of propofol analogs correlate with potency for potentiation of □-aminobutyric acid (GABA) current at the GABA(A) receptor but not with lipid solubility. *The Journal of pharmacology and experimental therapeutics*297(1): 338-351.
- LeBard DN, Henin J, Eckenhoff RG, Klein ML and Brannigan G (2012) General anesthetics predicted to block the GLIC pore with micromolar affinity. *PLoS computational biology* **8**(5): e1002532.
- Li J, Zhu T, Cramer CJ and Truhlar DG (1998) New Class IV Charge Model for Extracting

  Accurate Partial Charges from Wave Functions. *The Journal of Physical Chemistry A*102(10): 1820-1831.
- Liu R, Perez-Aguilar JM, Liang D and Saven JG (2012) Binding site and affinity prediction of general anesthetics to protein targets using docking. *Anesth Analg* **114**(5): 947-955.
- Lorber DM and Shoichet BK (1998) Flexible ligand docking using conformational ensembles. *Protein science : a publication of the Protein Society* **7**(4): 938-950.
- Lorber DM and Shoichet BK (2005) Hierarchical docking of databases of multiple ligand conformations. *Current topics in medicinal chemistry* **5**(8): 739-749.
- McCracken ML, Borghese CM, Trudell JR and Harris RA (2010) A transmembrane amino acid in the GABAA receptor β2 subunit critical for the actions of alcohols and anesthetics. *The Journal of pharmacology and experimental therapeutics* **335**(3): 600-606.

- McCreery MJ and Hunt WA (1978) Physico-chemical correlates of alcohol intoxication.

  Neuropharmacology 17(7): 451-461.
- Meng EC, Shoichet BK and Kuntz ID (1992) Automated docking with grid-based energy evaluation. *Journal of computational chemistry* **13**(4): 505-524.
- Murail S, Howard RJ, Broemstrup T, Bertaccini EJ, Harris RA, Trudell JR and Lindahl E

  (2012) Molecular mechanism for the dual alcohol modulation of Cys-loop receptors.

  PLoS computational biology 8(10): e1002710.
- Mysinger MM, Carchia M, Irwin JJ and Shoichet BK (2012) Directory of useful decoys, enhanced (DUD-E): better ligands and decoys for better benchmarking. *J Med Chem* **55**(14): 6582-6594.
- Nicholls A and Honig B (1991) A rapid finite difference algorithm, utilizing successive overrelaxation to solve the Poisson–Boltzmann equation. *Journal of computational chemistry* **12**(4): 435-445.
- Nury H, Van Renterghem C, Weng Y, Tran A, Baaden M, Dufresne V, Changeux J-P, Sonner JM, Delarue M and Corringer P-J (2011) X-ray structures of general anaesthetics bound to a pentameric ligand-gated ion channel. *Nature* **469**(7330): 428-431.
- Pettersen EF, Goddard TD, Huang CC, Couch GS, Greenblatt DM, Meng EC and Ferrin TE (2004) UCSF Chimera--a visualization system for exploratory research and analysis.

  \*Journal of computational chemistry 25(13): 1605-1612.
- Sauguet L, Howard RJ, Malherbe L, Lee US, Corringer PJ, Adron Harris R and Delarue M (2013) Structural basis for potentiation by alcohols and anaesthetics in a ligand-gated ion channel. *Nature communications* **4**: 1697.
- Shoichet BK and Kuntz ID (1993) Matching chemistry and shape in molecular docking.

  Protein Engineering 6(7): 723-732.

- Shoichet BK, Leach AR and Kuntz ID (1999) Ligand solvation in molecular docking.

  Proteins: Structure, Function, and Bioinformatics 34(1): 4-16.
- Sorin EJ and Pande VS (2005) Exploring the helix-coil transition via all-atom equilibrium ensemble simulations. *Biophysical journal* **88**(4): 2472-2493.
- Spurny R, Billen B, Howard RJ, Brams M, Debaveye S, Price KL, Weston DA, Strelkov SV, Tytgat J, Bertrand S, Bertrand D, Lummis SC and Ulens C (2013) Multisite Binding of a General Anesthetic to the Prokaryotic Pentameric Erwinia chrysanthemi Ligandgated Ion Channel (ELIC). *The Journal of biological chemistry* **288**(12): 8355-8364.
- Tasneem A, Iyer LM, Jakobsson E and Aravind L (2005) Identification of the prokaryotic ligand-gated ion channels and their implications for the mechanisms and origins of animal Cys-loop ion channels. *Genome biology* **6**(1): R4.
- Thompson AJ, Alqazzaz M, Ulens C and Lummis SCR (2012) The pharmacological profile of ELIC, a prokaryotic GABA-gated receptor. *Neuropharmacology* **63**(4): 761-767.
- Wagner CA (2000) The use of Xenopus laevis oocytes for the functional characterization of heterologously expressed membrane proteins. *Cell Physiol Biochem* **10**(1-2): 1-12.
- Warren GL, Andrews CW, Capelli A-M, Clarke B, LaLonde J, Lambert MH, Lindvall M, Nevins N, Semus SF, Senger S, Tedesco G, Wall ID, Woolven JM, Peishoff CE and Head MS (2005) A Critical Assessment of Docking Programs and Scoring Functions. *Journal of medicinal chemistry* 49(20): 5912-5931.
- Weiner SJ, Kollman PA, Case DA, Singh UC, Ghio C, Alagona G, Profeta S and Weiner P (1984) A new force field for molecular mechanical simulation of nucleic acids and proteins. *Journal of the American Chemical Society* **106**(3): 765-784.
- Weiner SJ, Kollman PA, Nguyen DT and Case DA (1986) An all atom force field for simulations of proteins and nucleic acids. *Journal of computational chemistry* **7**(2): 230-252.

Downloaded from molpharm.aspetjournals.org at ASPET Journals on August 16, 2017

Weng Y, Yang L, Corringer PJ and Sonner JM (2010) Anesthetic sensitivity of the Gloeobacter violaceus proton-gated ion channel. *Anesthesia and analgesia* **110**(1): 59-63.

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**Figure Legends** 

Figure 1. GLIC-propofol structure (PDB ID: 3P50) showing propofol in ball-and-stick and

transparent surface representation (black), bound near the top of the helical TM domains

within each subunit. (A) Side view. (B) View from the top of the TM domains, with one of

the subunits circled in blue.

Figure 2. Modulation of wild-type GLIC by novel compounds. Modulation of proton-

activated GLIC currents (pH 5.5, ~EC<sub>10</sub>) by vehicle (0.1% DMSO, D), 50 µM propofol (P,

black, dotted line) or the predicted ligand (50 µM) were determined from 4–15 measurements

as indicated at the base of every column. Significance is relative to vehicle, Dunnet's multiple

comparison test, ANOVA (\*\* $p \le 0.01$ , \*\*\*\* $p \le 0.0001$ ).

Figure 3. Predicted binding modes of compounds 4 and 7 in the propofol binding pocket of

GLIC. The carbon atoms of the discovered ligands are shown as yellow sticks and black

dotted lines indicate hydrogen bonds to the protein. The GLIC backbone is shown in white

ribbons with selected amino acids shown as sticks. Propofol is shown in black lines. This

figure was generated with PyMOL (version 1.4.1).

Figure 4. Correlation between potency and physico-chemical properties. (A) Percent

modulation versus lipophilicity (logP), with value for the correlation coefficient (R<sup>2</sup>) of a

linear regression fit (grey line). (B) Percent modulation versus molecular weight (Mw),

reported as in A.

**Figure 5.** Disruption of modulation by propofol site mutagenesis. (A) GLIC-propofol structure (PDB ID: 3P50) showing propofol in ball-and-stick and transparent surface representation (black), with residues within 5 Å of propofol shown as sticks. Residues mutated to probe propofol specificity are colored. (B) Propofol concentration-response curves for wild-type and mutant GLIC. Curves represent nonlinear regression fits for wild-type GLIC and all mutants except M205W and L206W, which did not follow standard inhibition profiles; for these two mutants, data points were connected through straight lines. Propofol inhibitory concentration 50 (IC<sub>50</sub>) values (in μM): Wild-type 24, I201F 21, I258W 70, I202W/I258W 50, Y254F 43. Number of oocytes tested: 2-15.

**Figure 6.** Effect of propofol and selected compounds from the virtual screen on wild type (WT) and mutated GLIC receptors activated at the 10% level. (A) Effects of vehicle (DMSO), propofol (P) and selected hit compounds at 10 μM on wild-type (WT) and M205W. (B) Effect of propofol (P) and virtually screened compounds (100 μM) on EC<sub>10</sub> responses in GLIC receptors. The results are grouped according to the DMSO concentration present (0.1% or 0.2%), determined by the concentration of the stock used. Significance for mutant vs. WT determined by unpaired t-test (\*\* $p \le 0.01$ , \*\*\*\* $p \le 0.001$ , \*\*\*\* $p \le 0.0001$ ), n= 2-9.

Figure 7. Effect of propofol and compounds identified in the virtual screen on GABA responses. (A) Modulation of EC<sub>10</sub> GABA responses in recombinant  $\alpha 1\beta 2\gamma 2$  GABA<sub>A</sub> receptors by 50 μM propofol (P) and selected hit compounds. Significance is versus a hypothetical value of 0 (\*p≤ 0.05, \*\* p≤ 0.01, \*\*\*\* p≤ 0.0001), one-sample t-test, n= 4-12. (B) Effect of mutation N265I in the β2 subunit (NI) on responses to 50 μM propofol and compounds 7 and 22. Significance is versus wild-type (\*p ≤ 0.05, \*\*\*p ≤ 0.001), unpaired t-test, n= 4-6.

# **Tables**

**Table 1.** Predicted ligands from the docking screen and analogs of positive hits that significantly inhibited GLIC. Activity is the percent inhibition of the proton-induced current in GLIC (see Figure 2 for details). A: analog of a positive hit from the docking screen.

	Structure	Activity	Docking		Structure	Activity	Docking
	Siructure	(%)	rank		Structure	(%)	rank
2	CH <sub>3</sub>	-77	698	16	H N N-N CI	-39	335
3	H <sub>3</sub> C Br	-66	351	17		-38	111
4	H <sub>3</sub> C—Br	-85	350	20	Br	-64	280
7	Br CH <sub>3</sub> N N H	-55	9	21	H <sub>2</sub> C N-N S NH	-43	497
8	$\bigcirc_{s}\bigcirc$	-46	208	22	HO——SCI	-63	399
9	CI	-43	179	23	Br—CH <sub>3</sub>	-65	A
11	H <sub>3</sub> C-S_Br	-77	313	24	Br-CH <sub>3</sub>	-48	A
15	H <sub>3</sub> C N	-41	67	26	H <sub>3</sub> C-\s\_CH <sub>3</sub>	-40	A

Figure 1

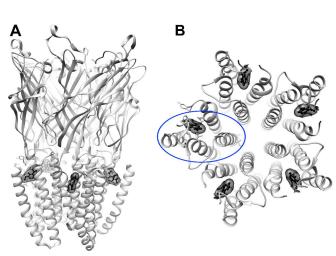


Figure 2

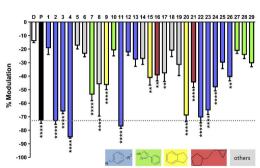


Figure 3

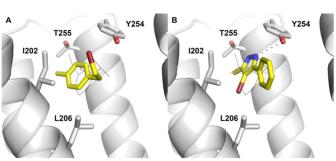


Figure 4

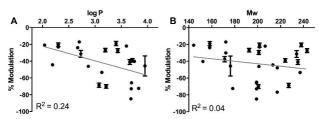


Figure 5

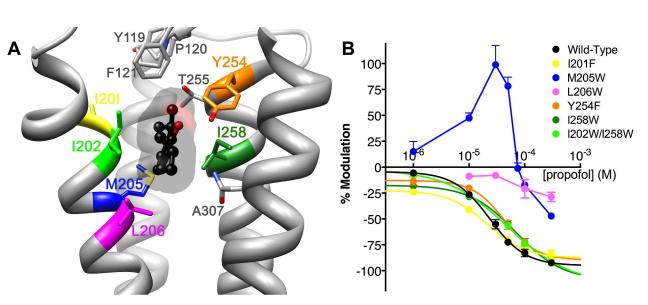


Figure 6

