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Introduction

The first indication that tricyclic antidepressants (TCAs) might have the potential to ameliorate neuropathic pain came from a 1960 study that found that patients treated with imipramine experienced pain relief.¹ By 1999, the off-label prescription of TCAs had become a mainstay in the treatment of neuropathic pain.² An analysis of placebo-controlled trials published at the time found that, with a number of conditions, including diabetic neuropathy, postherpetic

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Inhibition of N-type calcium ion channels by tricyclic antidepressants - experimental and theoretical justification for their use for neuropathic pain[†]

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A number of tricyclic antidepressants (TCAs) are commonly prescribed off-label for the treatment of neuropathic pain. The blockade of neuronal calcium ion channels is often invoked to partially explain the analgesic activity of TCAs, but there has been very limited experimental or theoretical evidence reported to support this assertion. The N-type calcium ion channel ($Ca_V 2.2$) is a well-established target for the treatment of neuropathic pain and in this study a series of eleven TCAs and two closely related drugs were shown to be moderately effective inhibitors of this channel when endogenously expressed in the SH-SY5Y neuroblastoma cell line. A homology model of the channel, which matches closely a recently reported Cryo-EM structure, was used to investigate via docking and molecular dynamics experiments the possible mode of inhibition of Cav2.2 channels by TCAs. Two closely related binding modes, that occur in the channel cavity that exists between the selectivity filter and the internal gate, were identified. The TCAs are predicted to position themselves such that their ammonium side chains interfere with the selectivity filter, with some, such as amitriptyline, also appearing to hinder the channel's ability to open. This study provides the most comprehensive evidence to date that supports the notion that the blockade of neuronal calcium ion channels by TCAs is at least partially responsible for their analgesic effect.

> neuralgia, peripheral nerve injury and central pain, numbers needed to treat (NNT) were lowest with TCAs, when compared to other drugs including the selective serotonin reuptake inhibitors, carbamazepine, gabapentin, dextromethorphan, tramadol, oxycodone and capsaicin.² Subsequently, a treatment algorithm developed at the University of Manitoba recommend four TCAs, amitriptyline, nortriptyline, imipramine and desipramine, as first line treatments for neuropathic pain.3 Studies and reviews that support the prescription of TCAs for a range of chronic pain conditions, including neuropathic pain, have continued to be published over the intervening years.^{4–6}

> Several authors have highlighted the need for strong scientific evidence to support the prescription of TCAs for neuropathic pain.^{7,8} Tricyclic antidepressants are known to be relatively unselective drugs that can simultaneously hit multiple pharmacological targets.^{7,9} Their analgesic effects have been partly attributed to the inhibition of noradrenaline and serotonin reuptake,¹⁰ adenosine uptake,¹¹ and voltage gated sodium ion channels,12 and the modulation of NMDA receptors.¹³ A preliminary report in 1990 also revealed that TCAs have the potential to block voltage gated calcium channels,¹⁴ and this conclusion was later supported by the

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results of an investigation of the effect of TCAs on the calcium-induced contraction of guinea pig ileum.¹⁵ A series of TCAs were also used to test a recombinant model for the N-type calcium ion channel (Ca_V2.2) expressed in a HEK 293 cell line.¹⁶ Nonetheless, while it is often stated that the blockade of neuronal calcium ion channels may at least partially account for the analgesic activity of TCAs,^{4,9,10,17} this property has been the subject of only very limited scientific investigation.

The N-type calcium ion channel is an established target for the treatment of neuropathic pain.¹⁸ The channel consists of a unique α 1 pore-forming subunit and auxiliary α 2- δ and β subunits. The general structure of the α 1 subunit is similar to that of other voltage-gated ion channels, comprising a single protein chain arranging itself into four domains (I–IV), each consisting of six transmembrane segments S1–S6 (Fig. 1). Three main features can be identified:

a) The P-loops between the S5 and S6 segments of each domain form the channel's selectivity filter. Single glutamate residues on each of the four loops combine to form a binding site capable of accommodating one or two calcium ions and allows the channel to select for calcium over other ions;¹⁹

b) The S6 segments from each domain combine to form the internal gate; and

c) The S4 segments act as the voltage sensor for the channel. As a result of the multiple positively charged residues (arginine and lysine) present on these segments, negative potentials across the cell membrane attract them down towards the inside of the cell, in turn constraining the internal gate segments and locking the channel shut. Conversely, depolarisation allows the S4 segments to slide upwards and the S6 segments to move apart, thus opening the gate.²⁰

The inhibition of the Ca_v2.2 channel is responsible for the pain-blocking activity of the intrathecally-delivered peptidic drug ziconotide or Prialt[®], which is a synthetic form of the cone snail venom peptide, ω -conotoxin MVIIA.²¹ The ability of this cystine knot peptide, and the closely related ω -conotoxin GVIA, to potently block Ca_v2.2 channels stimulated research into the development of small molecule mimics of these venom components.²² Work over a number of years led to range of lower-molecular weight inhibitors

that incorporated more drug-like features as the research progressed.^{23,24} Some of the most recently developed inhibitors bear a strong molecular similarity to TCAs,²⁵ as do others patented by NeuroMed Technologies.²⁶ This prompted the study described here, in which the N-type channelblocking ability of a set of thirteen drugs (Fig. 2) was examined using endogenously expressed Cav2.2 channel in the SH-SY5Y neuroblastoma cell line. The test drugs included a series of commonly prescribed TCAs and a small number of drugs that had a close molecular similarity to TCAs. Further, since until recently,²⁷ a crystal structure of the human Cav2.2 channel did not exist, an in silico model for this channel was developed which makes use of molecular dynamics (MD) simulations. This has allowed an intimate, theoretical investigation of the TCAs' mechanism of action at this channel.

Results and discussion

Biological assays

In the original study by Lavoie, Beauchamp and Elie,¹⁴ the ability of four TCAs, imipramine (1), desipramine (2), amitriptyline (3) and clomipramine (4), to inhibit voltage dependent calcium ion channels was measured through their effect on potassium-induced ⁴⁵Ca uptake in synaptosomes isolated from rat brain cortex. These TCAs were found to inhibit 45 Ca uptake with IC₅₀ values in the range 26–31 μ M. The current study used a modern calcium flux assay, which involved evaluation of the inhibition of the human Cav2.2 channel endogenously expressed in the neuroblastoma cell line, SH-SY5Y. This calcium flux imaging assay employed the $\mathrm{FLIPR}^{\mathrm{TETRA}}$ platform and included the $\mathrm{Ca_V1}$ blocker nifedipine. This is a well-established tool for determining inhibition of the human Cav2.2 channel by low molecular weight compounds and peptides, and the inclusion of nifedipine ensures that the vast majority of observed calcium responses are due to the Cav2.2 channel.28,29 Cilnidipine was used as a positive control.30

The test compounds (1-13) were chosen based on a number of criteria. Firstly, the TCAs examined by Lavoie *et al.* (1-4) were included. Secondly, the results of the study by Wong and co-workers⁸ were taken into account. They



Fig. 1 Representation of the α 1 subunit of the Ca_V2.2 channel oriented with the extracellular region at the top. Shown are the abbreviations used for each segment (SX_n) and the colour coding of the four domains (domain I, blue; domain II, red; domain II, green; domain IV, yellow). The selectivity filter is formed from the P_{I-IV} loops and the internal gate is formed from the S6 segments.

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reported that, of the TCAs commonly prescribed off-label, amitriptyline (3) was the one most likely to be prescribed for pain, followed by nortriptyline (5), trimipramine (6) and desipramine (2). Hence nortriptyline (5) and trimipramine (6) were included. Five other TCAs, doxepin (7), protriptyline (8), opipramol (9), maprotiline (10) and amoxapine (11), were chosen as these drugs are commonly prescribed tricyclic antidepressants in Australia³¹ and the United States³² and/or Europe. Finally, two structurally-related drugs, the muscle relaxant cyclobenzaprine (12) and the sedating antihistamine promethazine (13) were also tested. The purpose of choosing a wide set of TCAs for study was to gauge the generality of the Ca_v2.2 blockade by this class of drug and to look for any obvious structure–activity relationships. The calculated dose response curves obtained with these compounds are shown in Fig. 3 and $\rm IC_{50}$ values are presented in Table 1.

It can be seen that all of the chosen drugs were found to inhibit calcium influx through $hCa_v2.2$ channels at equivalent or better potency to the positive control, cilnidipine. Further, tricyclic structures predominantly consisting of a carbon framework and bearing a flexible amine sidechain tended to show slightly stronger inhibition (see data for 2–6, 8, 10 and 12), and secondary amines were preferred over tertiary (for example see data for 1 *versus* 2). It can also be seen that halogen substitution appeared to improve potency (see data for 1 *versus* 4). All of these findings provide valuable insights into how more effective $Ca_v2.2$ inhibitors based on the TCA structure might be developed.



Fig. 3 Activities of the test drugs in $hCa_V2.2$ channels, determined by calcium influx fluorescence-imaging assays. Concentration-response curves for inhibition of $hCa_V2.2$ under application of serial diluted concentrations of drugs **1–13** and the Ca_V2.2 control, cilnidipine. Data are presented as mean ± SEM from n = 3-5 independent experiments. The calculated IC₅₀ values are shown in Table 1.

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Table 1 Functional inhibition of the calcium channels $hCa_V2.2$ by test drugs **1–13** and positive control cilnidipine. Data are presented as mean \pm SEM and 95% CI from n = 3-5 independent experiments

Drug	IC_{50} (μM)	SEM	95% CI (µM)
Cilnidipine	26	4	9-43
Imipramine (1)	22	5	7-36
Desipramine (2)	11	2	5-16
Amitriptyline (3)	12	3	5-20
Clomipramine (4)	9	4	1-19
Nortriptyline (5)	10	1	7-12
Trimipramine (6)	11	2	5-16
Doxepin (7)	18	4	7-29
Protriptyline (8)	14	3	6-23
Opipramol (9)	24	7	6-42
Maprotiline (10)	10	2	5-14
Amoxapine (11)	27	4	15-39
Cyclobenzaprine (12)	10	2	5-16
Promethazine (13)	18	3	9-28

In silico studies

As indicated above, until recently there was no resolved structure for Cav2.2 available, however Martinez-Ortiz and Cardozo had published a homology model of the poreforming a1 subunit of the Cav2.2 channel,33 constructed from a rabbit Cav1.1 single-particle Cryo-EM map (PDB: 5GJV).³⁴ These researchers paid special attention to accurately modelling the S1 to S4 segments containing the channel's voltage-sensing domains³³ (Fig. 1 and 4) which are of particular importance to its gating dynamics. In the present study, Martinez-Ortiz and Cardozo's static homology model was used as a basis for a theoretical construct which could be employed to probe the mechanism of inhibition of human Cav2.2 channel by TCAs. This involved embedding the homology model into a simulated cell membrane, incorporating a simulated salt solution and making use of MD to model channel behaviour. The theoretical model developed in this way was also compared to the recently

published human Ca_v2.2 structure developed through the use of Cryo-EM. $^{\rm 27}$

Protein equilibration. The Ca_v2.2 homology model was first subjected to all-atom MD simulations to assess its stability and further refine it. Using the online server CHARMM-GUI,³⁵ the Ca_v2.2 structure was embedded in a membrane of 85% 1-palmitoyl-2-oleoylphosphatidylcholine (POPC)/15% cholesterol,^{36,37} then the system was solvated in 0.15 M sodium chloride and a 36 ns simulation was launched using the NAMD 2.13 package.

The root-mean-square deviation (RMSD) of the nonhydrogen atoms and protein backbone started to plateau around 15 ns at 5.1 Å, which suggested that a local equilibrium had been reached (Fig. S1, ESI†). The transmembrane domains were quite stable with an average backbone RMSD of only 2.6 Å. To equilibrate the structure with calcium ions, the water and sodium chloride were then removed, and an aqueous 0.15 M calcium chloride solution was introduced, and a further 60 ns simulation was run. In this case, the RMSD of the non-hydrogen atoms started to plateau at around 20 ns of simulation time (Fig. S2, ESI†) at a value of 3.9 Å, with the transmembrane backbone deviating by only 2.2 Å. The structure obtained at the end of the simulation was then extracted and used in subsequent experiments.

It was found in the second simulation that as expected, calcium ions were quickly attracted towards the channel by the multiple acidic residues on the S5-P1 and P2-S6 loops. After approximately 3 ns of simulation time the selectivity filter was populated by two calcium ions (Fig. 5). Spontaneous calcium permeation through the channel was not observed as the intracellular gate remained closed. As our model was constructed with periodic boundary conditions, polarisation across the membrane was absent, thus there was no voltage potential to drive the structural shifts required for channel opening to occur. This was also observed in a study of the Ca_v1.2 channel, where the



Fig. 4 Image showing the structure of the Martinez-Ortiz and Cardozo homology model of the α 1 subunit of the Ca_V2.2 channel, which was constructed from a rabbit Ca_V1.1 single-particle Cryo-EM map.³³ Left: side view, right: top (extracellular) view. Domains I to IV are coloured blue, red, green and yellow respectively, consistent with colour coding defined in Fig. 1.



Fig. 5 Snapshot of the $Ca_{v}2.2$ channel following MD simulations with NaCl then $CaCl_2$ solutions. Left: Side view of the channel (initial state of the homology model is overlayed in transparent grey). Right: Selectivity filter and associated calcium ions (pink spheres).

introduction of an external electric field and a steering force were needed to push a calcium ion into the channel, ultimately resulting in its passage through the channel.³⁸

Comparison between equilibrated homology model and the Cryo-EM structure. Using the Schrödinger Maestro package, the equilibrated homology model was aligned with the recently released Cryo-EM structure of the N-type calcium channel (PDB: 7MIY)²⁷ and a backbone RMSD of 3.9 Å was found. The main deviation between the two structures appears to come from the extra- and intracellular loops that occur between the transmembrane segments, and the intracellular S6-S1 segments between each domain. Given that these regions of the protein are more free-flowing during the MD simulation and expected to be more mobile in vivo, a backbone RMSD of almost 4 Å is reasonable. The core structure of the pore formed from the S4-S5, S5, P1 and S6 segments, where the TCAs were found to dock (vide infra), were however very similar between the three structures (Fig. 6). The RMSD for this part of the structure was found to be only 1.9 Å. This value is well within the range of those observed during the MD simulations and suggests that either structure could be used to model TCA binding.

Docking. Having obtained an equilibrated Cav2.2 model embedded in a simulated lipid bilayer and surrounded by a calcium chloride solution, attention was then turned to docking the TCAs into the channel to investigate possible binding modes and positions. The TCA structures were first imported into Schrödinger Maestro, and Glide was used to dock rigidly the compounds onto the model. As starting points, the binding of the TCAs on either side of selectivity filter were considered. The relevant region above the selectivity filter is represented on the refined Cav2.2 structure in Fig. 7 by a purple rectangle, whereas the region below the selectivity filter is represented by a black rectangle. These regions encompass the locations of several inhibitors in Cavligand and Nav-ligand Cryo-EM structures available in the Protein Data Bank: Three Cav1.1 blocking drugs, diltiazem (PDB: 6JPB), nifedipine (PDB: 6JP5) and verapamil (PDB: 6IPA), were found to bind in the Cav1.1 channel in the internal cavity below the selectivity filter and above the internal gate.³⁹ The synthetic Ca_v3.1 inhibitor Z944 binds to the Ca_v3.1 channel in a similar manner (PDB: 6KZP).⁴⁰ By contrast, the recently published Cryo-EM study of the Cav2.2 channel, ω-conotoxin MVIIA (ziconotide) was shown to bind just above the selectivity filter, sterically blocking access to it through strong interactions with the P2_{II} segments, as well as the S5-P1_{III} and S5-P1_{IV} loops (7MIX).²⁷ Consistent with this finding, ω -conotoxin GVIA, a peptide that also selectively blocks the Cav2.2 channel, was predicted by Chen and Chung to dock in a similar manner during MD simulations on a homology model of the Cav2.2 selectivity filter based on bacterial NavAb channel.41 Two other natural marine toxins, tetrodotoxin (PDB: 6J8I, 6J8J) and saxitoxin (PDB: 6J8G, 6J8H), block the more distantly related Nav1.7 channel by obstruction of the Nav1.7 selectivity filter itself, on the



Fig. 6 An overlay of the side view of the identified TCA binding site for the post-equilibration homology model (blue) and the Cryo-EM structure (black).²⁷



Fig. 7 Side view of the homology model of the $Ca_V 2.2$ channel, which has been refined using MD simulations, showing potential inhibitor binding sites. The purple rectangle encompasses the location of inhibitors that interfere with the selectivity filter and the black rectangle highlights a binding region consisting of an internal cavity between the selectivity filter and the internal gate.

extracellular side, at the convergence of the four $P2_{I-IV}$ segments that together form the filter.⁴²

Taking into account the two main reported voltage-gated ion channel inhibitor binding positions mentioned above, a very large box with dimensions $26 \times 26 \times 26$ Å, centered on the selectivity filter glutamate residues, was used to investigate possible TCA binding sites in the Ca_v2.2 channel. The box included the lipophilic pockets on both the intraand extra-cellular sides of the selectivity filter. From docking experiments performed within this region, it was found that almost all TCAs localised in the same general region, in the central cavity between the selectivity filter and internal gate, encompassed by the black rectangle shown in Fig. 7. Within these, several docking modes were observed, as detailed below.

Binding mode 1: amitriptyline/maprotiline-like. A first cluster of compounds – imipramine (1), amitriptyline (3), nortriptyline (5), protriptyline (8), maprotiline (10) and promethazine (13) – were observed to dock under the $P1_{III}$ segment of the selectivity filter and between the $S6_{III}$, $S5_{III}$ and $S6_{IV}$ segments, as represented in Fig. 8 and 9. This is analogous to where nifedipine was shown to bind in the $Ca_V 1.1$ channel.³⁹

The interaction diagram for maprotiline (**10**, Fig. 9) reveals that the lipophilic head group is in close contact with hydrophobic residues on all three segments – S6_{III}, S5_{III} and S6_{IV}. Despite the close proximity of aromatic residues such as Tyr¹²⁸⁹, Phe¹⁴⁰⁷ and Phe¹⁶⁰³, no π - π interactions could be detected, but it seems likely that they could occur if the TCA-protein complex was allowed to relax. Amitriptyline (**3**, Fig. 10) on the other hand was found to form one such π - π interaction between one of its aromatic rings and Phe¹⁴⁰³, with the ammonium group forming a cation- π interaction with the side chain of Phe¹⁴⁰⁷. The other coordinating residues are almost identical to maprotiline's.

By analogy with the mechanism of inhibition proposed for nifedipine,³⁹ it is reasonable to expect that by associating with both $S6_{III}$ and $S6_{IV}$, the inhibitors that bind in this region have a mode of action that acts to constrain the two segments from moving apart, and thus limiting the internal gate's ability to open. Maprotiline's propylammonium sidechain extends to make a hydrogen bond with one of the selectivity filter glutamate residues, Glu^{1655} , whose sidechain had been pulled down under the pressure of calcium ions in the MD equilibration simulation. While this may be a less representative conformation for this amino acid, it seems likely that the positively charged ammonium group would remain drawn to the negative residues of the selectivity filter, and thus also obstruct calcium ions from passing through.

Binding mode 2: desipramine-like. Desipramine (2) and opipramol (9) were found to bind in the cavity between the



Fig. 8 Images showing binding mode 1 with overlays of binding poses of imipramine (1), amitriptyline (3), nortriptyline (5), protriptyline (8), maprotiline (10) and promethazine (13) docked into the refined $Ca_{v}2.2$ structure; side (left) and top (right) views.



Fig. 9 Left: 3D representation showing amino acid residues within 4 Å of maprotiline (10). Right: Ligand interaction diagram (within 4 Å) for maprotiline docked into the refined $Ca_V 2.2$ structure.



Fig. 10 Left: 3D representation showing amino acid residues within 4 Å of amitriptyline (3). Right: Ligand interaction diagram (within 4 Å) for amitriptyline docked into the refined $Ca_V 2.2$ structure.

selectivity filter and the internal gate of Ca_v2.2 (Fig. 11), in a similar position to where diltiazem was shown to bind in Ca_v1.1.³⁹ The tricyclic heads of desipramine (2) and opipramol (9) were found to associate primarily with residues from the S6_I and S6_{II} segments, as well as Phe¹⁷⁰³ on S6_{IV} and Phe¹⁴⁰⁷ and Phe¹⁴¹¹ on S6_{III}. The ammonium sidechain of desipramine was predicted to coordinate with Glu¹⁶⁵⁵, while opipramol's piperazinylethanol sidechain appeared to associate with the four segments forming the selectivity filter, P1_I, P1_{II}, P1_{III} and P1_{IV}.

Alternative binding modes. Trimipramine (6) and cyclobenzaprine (12) (Fig. 12A) were found to localise in a similar region as the amitriptyline/maprotiline cluster, between $S6_{III}$, $S5_{III}$ and $S6_{IV}$, but their orientations were reversed, with their ammonium sidechains pointing between $S6_{IV}$ and $S5_{III}$, making a hydrogen bond with Ser^{1696} in an otherwise largely hydrophobic environment. This binding mode is expected to be unstable, however, as it seems more plausible that *in vivo*, cyclobenzaprine in particular would

ultimately reorient and bind in a similar way to its closely related analogues imipramine (1), amitriptyline (3) and nortriptyline (5). Doxepin (7) and amoxapine (11) (Fig. 12B) were found to bind in a similar way to 6 and 12. Their ammonium groups were found to make hydrogen bonds with the carbonyl oxygen of Phe¹⁴⁰⁰, while the tricyclic system was seen to be coordinated by residues on S6_{III} and the edges of P1_{II} and P1_{III}, leaving a high degree of exposure to water.

Finally, clomipramine (4) (Fig. 13) was found to dock between $P1_{III}$ and $P2_{III}$, on the extracellular side of the channel. For these last three compounds (4, 7 and 11), it is not clear why they would be active if the identified docking sites were their actual primary *in vivo* binding sites. Given their close structural similarity with the other TCAs, they might be expected to dock in one of the other sites discussed previously; although it should be noted that doxepin (7) and amoxapine (11) differ from other TCAs by having an oxygen atom in the tricyclic structure and clomipramine (4) is the only halogenated TCA considered in this study. Nonetheless,



Fig. 11 Images showing binding mode 2 with overlays of binding poses of desipramine (2, tubular representation) and opipramol (9, wire representation) docked into the refined $Ca_V 2.2$ structure. Left: Side view of docking site. Right: Interaction diagram for desipramine (2).

this highlights that non-inhibiting docking sites for TCAs probably exists, which may contribute to their moderate (double digit micromolar) activities and relatively small differences between measured IC_{50} values.

Molecular dynamics simulations of docked structures. In order to further refine the structures obtained from the rigid docking experiments, MD simulations were run with five representative Cav2.2-TCA complexes. Structures in which amitriptyline (3), nortriptyline (5) and maprotiline (10) had been docked were taken as representative examples for binding mode 1, and the structure docked with desipramine (2) as representative of binding mode 2. Of the alternative binding modes, the structure docked with trimipramine (6) was considered, as in this case the TCA appeared to be in an unstable pose, and MD simulations were expected to allow it to relax into a more realistic orientation. In each case, the docking pose was copied onto the base model and 150 ns simulations were then carried out. A blank simulation with no ligand was also performed as a reference. No significant conformational shifts of the protein were observed throughout these simulations. In particular, the internal gate remained closed and the backbone RMSD of the transmembrane domain hovered around 2.5 Å, in line with what was observed during the initial equilibration phase described above (Fig. S3, ESI[†]).

Maprotiline's tetracyclic ring system was found to be very stable in its initially docked position (binding mode 1, Fig. 14), with an average RMSD of 2.27 Å. The main interactions predicted by Glide – Glu¹⁶⁵⁵, Phe¹⁴⁰⁷, Thr¹³⁶³, Tyr¹²⁸⁹, Ser¹⁶⁹⁶, Phe¹⁴⁰³, Ile¹⁶⁹² – persisted throughout the simulation. The ammonium group, however, was observed to move closer to the selectivity filter, with the methyl substituent becoming positioned just under the calcium ion.

Amitriptyline's tricyclic system was found to rotate by around 60 degrees from its initial docking pose while the ammonium group moved slightly closer to the selectivity filter – as was observed for maprotiline – within the first nanosecond (Fig. 15). From this point onwards it remained in place, with an average RMSD of 2.18 Å. The interactions with Leu¹²⁸⁶, Tyr¹²⁸⁹ (S5_{III}); Phe¹³⁵⁹, Thr¹³⁶³ (P1_{III}); Phe¹⁴⁰³, Phe¹⁴⁰⁶, Phe¹⁴⁰⁷ (S6_{III}); Glu¹⁶⁵⁵ (P1_{IV}); Ile¹⁶⁹², Phe¹⁶⁹³ and Ser¹⁶⁹⁶ (S6_{IV}) predicted by the rigid docking also persisted throughout the simulation.

When the $Ca_v 2.2$ -desipramine docked complex (binding mode 2) was employed as the starting point for the MD simulation, the TCA was observed to move around the surface of the internal gate; however, cluster analysis – using a RMSD



Fig. 12 A: Docking mode of trimipramine (magenta) and cyclobenzaprine (ochre). B: Docking mode of amoxapine (magenta) and doxepin (ochre).

S5-P1;;; P2;;;

Fig. 13 Docking mode of clomipramine.

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Fig. 14 Image showing the side view of the structure resulting from the MD simulation run on the $Ca_V2.2$ -maprotiline docked complex. Transparent: maprotiline's starting position predicted through Glide docking; solid: final position.

cutoff of 2.0 Å – found a major cluster (magenta, Fig. 16) encompassing most of the conformations observed during 30 to 129 ns of the simulation. In this position, the ligand is coordinated by residues on the four segments forming the internal gate: Met^{347} (S6_I), Leu^{700} , Phe^{704} (S6_{II}), Phe^{1407} , Val^{1408} , Phe^{1411} (S6_{III}) and Phe^{1703} (S6_{IV}). The ammonium tail appeared to help keep the Glu¹⁶⁵⁵ (P1_{IV}) sidechain in its "down" conformation, indicating that it could most likely disrupt the selectivity filter.

Interestingly, while nortriptyline rigidly docked in the same mode as its methylated analogue amitriptyline (binding



Fig. 15 Image showing the side view of the structure resulting from the MD simulation run on the $Ca_v2.2$ -amitriptyline docked complex. Transparent: amitriptyline's starting position predicted through Glide docking; cyan: averaged position from the main conformational cluster.



Fig. 16 Image showing the side view of the structure resulting from the MD simulation run on the Ca_v2.2-desipramine docked complex. Transparent: desipramine's starting position predicted through Glide docking; magenta: desipramine's averaged position from the main conformational cluster identified during 30 to 129 ns of the simulation.

mode 1), this TCA was observed to drift from the pocket between $S6_{III}$ and $S6_{IV}$ within the initial nanoseconds of the simulation, and settled between $S6_{III}$ and $S6_{II}$, under $P1_{II}$ (Fig. 17), which is the analogous docking site of verapamil in $Ca_V 1.1.^{39}$ There nortriptyline markedly obstructs the selectivity filter, with the tricyclic head leaning on hydrophobic residues on these three segments, while its ammonium tail extended to coordinate Met³¹³ on $P1_I$ and/or Glu^{1655} on $P1_{IV}$. More precisely, cluster analysis using a RMSD cutoff of 2.0 Å revealed three poses; in each case, interactions with the following residues were observed: Pro^{1404} , Phe^{1407} , $(S6_{III})$, Thr^{1363} ($P1_{II}$), Leu700 ($S6_{II}$), Met^{313} ($P1_I$), Glu^{1655} ($P1_{IV}$). Further details can be found in Table S1 (ESI†).

When MD calculations were performed with the $Ca_v 2.2$ trimipramine docked complex (initially considered to be an alternative binding mode), the TCA was observed to flip around within the first 15 ns and adopt a pose more in line with the amitriptyline-maprotiline docking mode (binding mode 1). In this adjusted pose, the ammonium tail is facing the P-loop of the selectivity filter. Three related poses were identified by cluster analysis, as represented in Fig. 18; cluster 1 (cyan) in particular – accounting for approximately 80 ns of the 150 ns simulation – closely aligns with the amitriptyline simulation. The coordinating residues, described in Table S2 (ESI†), are almost identical in each cluster. Interestingly, the cluster 1 and cluster 2 **Research Article**



Fig. 17 Image showing the top view of the structures resulting from the MD simulation run on the Ca_v2.2-nortriptyline docked complex. Grey: nortriptyline's starting position predicted through Glide docking; cyan, ochre and magenta: nortriptyline's main poses observed during MD calculations. These poses are presented separately in the ESI.†

conformations alternated at around 97 ns then 119 ns of simulation time.

Conclusions

While it is often stated that the inhibition of neuronal calcium ion channels may be partially responsible for the effectiveness of TCAs in the treatment of neuropathic pain, until now, there has been very little scientific evidence to support this assertion. In the current study, a set of eleven TCAs and two related drugs were evaluated for their ability to inhibit the human N-type or $Ca_v 2.2$ channel endogenously expressed in the neuroblastoma cell line, SH-SY5Y. The

Ca_v2.2 channel was chosen because, amongst the human neuronal calcium ion channels, the Cav2.2 channel is one of the most well validated targets for neuropathic pain drug development. It was found that all of the test drugs showed moderate inhibition of the $hCa_v 2.2$ channel, with those predominantly consisting of a carbon framework and bearing a flexible amine sidechain (2-6, 8, 10 and 12) eliciting slightly stronger responses. These compounds were found to be more than two-fold stronger inhibitors of the $hCa_V 2.2$ channel than the positive control, cilnidipine, a N-type channel blocker that has been shown to effectively suppress nociception in vivo.43 Other structure-activity relationships were also revealed and together may provide useful guidance in the development of more effective drugs for neuropathic pain based on the TCA core structure. Importantly, for the purposes the current study, the inhibition results provide further validation for the off-label prescription of TCAs for neuropathic pain. The magnitude of the obtained IC50s, bordering on single digit micromolar activity, while generally superior to that produced by cilnidipine, does however support the notion that the observed therapeutic effect of certain TCAs in the treatment of neuropathic pain does not solely result from their ability to block the Cav2.2 channel. Indeed, TCAs are known to be relatively promiscuous drugs and are thought to elicit their pain killing effect through a range of channels and receptors. While, in the presence of nifedipine, the vast majority of calcium responses in the SHSY5Y cell line have been shown to be due to Cav2.2 channel activity, a residual signal for T-type calcium channels has been identified.²⁹ The complete block of calcium channel activity at high TCA concentrations (data not shown) therefore points to likely T-type inhibition by these drugs. This property of TCAs, as well as potential state-dependent effects and ion channel subtype selectivities, are currently being investigated in detail.

In order to gain insights into the mechanism of action of TCAs on the $Ca_v 2.2$ channel, an *in silico* model of the poreforming $\alpha 1$ subunit of the $Ca_v 2.2$ channel, previously constructed from a static rabbit $Ca_v 1.1$ single-particle Cryo-



Fig. 18 Image showing the structures resulting from the MD simulation run on the Ca_V2.2-trimipramine docked complex. Left: Side view; right: top view. Transparent grey: trimipramine's starting position predicted through Glide docking; cyan, ochre and magenta: trimipramine's main poses observed during MD calculations. These poses are presented separately in the ESI.†



Fig. 19 Structure of the $Ca_V 2.2$ channel at 150 ns simulation time. Left: The black rectangle indicates the general region of the $Ca_V 2.2$ channel where the TCAs were predicted to bind. Right: Maprotiline (cyan) and the representative desipramine cluster (magenta), highlighting the two main TCA binding modes found in this study.

EM map, was used as a starting point. The homology model was embedded into a simulated cell membrane, and MD simulations, which incorporated a simulated calcium chloride solution, were used to model channel behaviour. The transmembrane component of the model thus obtained compared favourably with a recently reported Cryo-EM structure of the human $Ca_v 2.2$ channel. Rigid docking of the selected TCAs, followed by further MD simulations, revealed two plausible binding sites for TCAs in the human $Ca_v 2.2$ channel. These correspond to identified binding sites for known blockers of other calcium channels, $Ca_v 1.1$ and $Ca_v 3.1$, revealed in recent Cryo-EM studies. The two binding sites in the $Ca_v 2.2$ channel found with desipramine and maprotiline are illustrated in Fig. 19.

Desipramine and opipramol prefer to bind between the four S6 segments. Like diltiazem in Cav1.1 and Z944 in Cav3.1,⁴⁰ desipramine appears to inhibit the channel by physically obstructing the pore, preventing calcium ions from passing through. Maprotiline and most other TCAs were predicted to settle in a pocket formed between S5_{III}, S6_{III} and S6_{IV}, in a similar manner to nifedipine in Cav1.1.39 Dihydropyridines like nifedipine are state-dependent allosteric inhibitors of L-type calcium channel (Cav1) with higher affinity for the inactivated states in which the internal gate remains closed.⁴⁴ By interacting with two of the S6 segments forming the internal gate, these compounds are thought to prevent the necessary twisting and bending of the S6 segments to widen the pore,⁴⁵ therefore keeping the internal gate locked and preventing the calcium ions from passing through. Presumably maprotiline and the other TCAs predicted to bind in this site act in a similar way.

Comparison of the refined homology model described here with the recently resolved Cryo-EM structure of $Ca_v2.2$ revealed a high degree of similarity, supporting the validity of the modelling undertaken. Calcium ion channel homology models built from closely related calcium channels, and for which there are no experimentally-obtained structures, can therefore be expected to provide highly accurate structures useful for docking and MD studies, as the examples here demonstrate.

Experimental section

Biological evaluation

All of the test drugs were obtained from Sigma-Aldrich Pty Ltd except desipramine (2), which was obtained from Toronto Research Chemicals. All were hydrochloride salts except trimipramine (6), which was a maleate salt, and amoxapine (11) which was unprotonated. The bioactivity of the test drugs and inhibition control cilnidipine (Alomone, Jerusalem, Israel) were evaluated by calcium influx assays using the Fluorescence-Imaging Plate Reader Tetra (FLIPR^{TETRA}, Molecular Devices, CA, USA). Calcium influx measures were used for the evaluation of Cav2.2 channels endogenously expressed in the neuroblastoma SH-SY5Y. Briefly, neuroblastoma SH-SY5Y cells were seeded at 40000 and 10000 cells per well in 384 well flat clear-bottom black plates (Corning, NY, USA) and cultured at 37 °C in a humidified 5% CO2 incubator 48 h before assay. Cells were loaded with 20 µL per well of Calcium 4 dye (Molecular Devices) reconstituted in assay buffer containing (in mM) 140 NaCl, 11.5 glucose, 5.9 KCl, 1.4 MgCl₂, 1.2 NaH₂PO₄, 5 NaHCO₃, 1.8 CaCl₂,10 HEPES pH 7.4 and 0.1% bovine serum albumin (BSA, Sigma), and incubated for 30 min at 37 °C in a humidified 5% CO2 incubator. Nifedipine 10 µM (Cav1 blocker) was added to the dye solution. The Ca²⁺ fluorescence responses were recorded at excitation 470-495 nm and emission 515-575 nm for 10 s to set the baseline, 300 s after addition of compound and for further 300 s after channel activation induced by the addition of 90 mM KCl and 5 mM CaCl₂. Compound stock solutions were prepared at 100 mM in 100% DMSO and diluted further in the assay buffer to 1% DMSO, for the highest tested concentration of 100 μM of compound, and serial-diluted 3-fold in assay buffer.

In silico studies

Model construction. The $Ca_V 2.2$ homology model created by Martinez-Ortiz and Cardozo³³ was obtained from their public GitHub repository.⁴⁶ The structure was then reoriented using the Position of Proteins in Membranes (PPM) server⁴⁷ to place the centre of the protein at the origin and the membrane normal parallel to the *Z* axis. The CHARMM-GUI server³⁵ was then used to generate a membrane containing approximately 15% cholesterol and 85% POPC and solvate the system in a solution of 0.15 M sodium chloride, using the TIP3P water model. A total of 168 cholesterol molecules, 952 POPC molecules, 181681 water molecules (TIP3P), 507 sodium ions and 507 chloride ions were added in an orthorhombic cell of dimensions 201.6 × 201.6 × 185.4 Å³.

All following MD simulations were then performed employing the NAMD 2.13 MD package with the CHARMM36 force field, under NPT conditions in a periodic box, with the temperature (310 K) and pressure (1.01325 bar) maintained using Langevin dynamics. A cut-off distance for interactions was set at 12 Å and a timestep of 2 fs.⁴⁸ Calculations were performed on the M3G partition of the MASSIVE M3 cluster at Monash University using 12 cores of an Intel Xeon Gold 6150 processor and one Nvidia Tesla V100 GPU.⁴⁹ Postsimulation analysis and further refining of the model was carried out using the VMD package.⁵⁰

After a preliminary 1000 step minimisation, a 18 000 000step simulation (36 ns) with no constraints was then launched. After extracting the state of the system at the end of this first simulation, the water and ions were removed, and a 0.15 M solution of calcium chloride was regenerated at a 4 Å distance from the protein and membrane molecules. A total of 165 658 water molecules, 469 calcium ions and 938 chloride ions were thus added in an orthorhombic cell of dimensions $200 \times 200 \times 180$ Å³. A second simulation was then set to run for 30 000 000 steps (60 ns).

Docking. The protein and TCA structures were imported in the Schrödinger Maestro suite,⁵¹ and a receptor grid of 26 \times 26 \times 26 Å³ centred on the selectivity filter residues Glu314, Glu663, Glu1365 and Glu1665 was generated. The ligands were then docked using the Glide subprogram.⁵²

Molecular dynamics. The docked conformations of maprotiline, amitriptyline, desipramine, nortriptyline and (*R*)-trimipramine were extracted and the SWISS-Param⁵³ online server was used to generate parameters for the following MD simulations. The system size was reduced to comprise 376 POPC molecules, 59 cholesterol molecules, 41 489 water molecules, 11 calcium ions, 117 sodium ions, 140 chlorine ions and the ligand, in a cell of dimensions 140 × 120 Å³. Simulations of 150 ns for each Ca_V2.2–TCA complex (as well as a control simulation with no ligand) were then launched in parallel using the same parameters as in the previous section. Cluster analysis of the TCAs over the course of the simulation was carried out using the Clustering VMD plugin,⁵⁴ using an RMSD cutoff of 2 Å.

Conflicts of interest

The authors declare no competing financial interest.

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