# **In Silico Human Cardiomyocyte Action Potential Modelling: Exploring Ion Channel Input Combinations**

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**Abstract:** *In silico* modelling offers an opportunity to supplement and accelerate cardiac safety testing. With in silico modelling, computational simulation methods are used to predict electrophysiological interactions and pharmacological effects of novel drugs on critical physiological processes. The O'Hara-Rudy's model was developed to predict the response to different ion channel inhibition levels on cardiac action potential duration (APD) which is known to directly correlate with the QT interval. APD data at 30% 60% and 90% inhibition were derived from the model to delineate possible ventricular arrhythmia scenarios and the marginal contribution of each ion channel to the model. Action potential values were calculated for epicardial, myocardial and endocardial cells, with action potential curve modelling. This study assessed cardiac ion channel inhibition data combinations to consider when undertaking in silico modelling of proarrhythmic effects as stipulated in the Comprehensive in Vitro Proarrhythmia Assay (CiPA). As expected, our data highlight the importance of the delayed rectifier potassium channel  $(I_{Kr})$  as the most impactful channel for APD prolongation. The impact of the transient outward potassium channel  $(I_{to})$  inhibition on APD was minimal while the inward rectifier  $(I_{K1})$  and slow component of the delayed rectifier potassium channel  $(I_{Ks})$  also had limited APD effects. In contrast, the contribution of fast sodium channel  $(I_{Na})$  and/or L-type calcium channel  $(I_{Ca})$ inhibition resulted in substantial APD alterations supporting the pharmacological relevance of in silico modelling using input from a limited number of cardiac ion channels including  $I_{Kr}$ ,  $I_{Na}$  and  $I_{Ca}$ , at least at an early stage of drug development.

**Keywords:** *In silico*, O'Hara Rudy model, action potential duration; torsade de pointes, hERG, CiPA

#### **1. Introduction**

Cardiac ion channel evaluation, using both *in vitro* and *in silico* methods, is an important aspect of safety assessment during drug development to determine the potential risk of arrhythmia development such as ventricular tachycardia, torsades de pointes, or polymorphic ventricular tachycardia (TdP) <sup>1</sup> <sup>2</sup> . *In vitro* evaluation of the potential of a drug to block the human ether-à-go-go related gene (hERG) channel (also called, rapid delayed rectifier potassium current  $I_{kr}$ , and other major channels such as the voltage-gated calcium (Cav) and sodium (Nav) channels, Cav 1.2 and Nav 1.5, respectively, are important during proarrhythmia risk assessment <sup>2</sup>. Kramer *et al*. showed that drugs with  $I_{kr}$  block combined with late sodium and/or calcium current block had lower TdP risk than drugs that only blocked  $I_{\text{kr}}$ <sup>234</sup>.

Drug development does not systematically include all ion channels that are included in the O'Hara-Rudy model. Time and resources are the main reasons for conducting patch clamp analyses only on a subset of cardiac ion channels. Given the very high number of drug candidates in development, it would often not be feasible to evaluate inhibition for all ion channels, for all drug candidates. One important advantage of *in silico* modelling is the rapid generation of relevant safety data. *In silico* modelling can be used at very early stages of drug development when the work is initiated, and it can be repeated when additional ion channel data is generated for compounds that were selected from the preliminary data. Ion channels that have the greatest impact on cardiac repolarization (*i.e.*, hERG, Nav1.5 and Cav1.2) are typically the first ones tested. Compounds that have favorable profiles for these channels are then advanced to later stages of development<sup>2</sup>. In *silico* modelling is used to predict proarrhythmic risk associated with new drugs by leveraging patch clamp data from individual ion channel and complementing this data using the O'Hara Rudy dynamic (ORd) model of human ventricular cells. This approach can alleviate some of the limitations associated with multi-ion channel *in vitro* methods, including sourcing human ventricular myocytes, and assays using non-cardiac or nonhuman cells<sup>5</sup>. The latter may not express subunit and anchoring proteins important for ionic channel kinetics necessary to assess arrhythmia risk <sup>6</sup> <sup>7</sup> . Other *in silico* models have been considered such as the TdP risk metric (qNet). This metric involves analyzing drug-induced changes in net charge during the action potential (AP) <sup>8</sup> <sup>9 10 11</sup>. The O'Hara Rudy *in silico* model was developed to better understand human ventricular electrophysiology by dissecting the electrophysiology contribution of potassium  $[I_{Kr}$  (rapid delayed rectifier  $K^+$  current),  $I_{Ks}$  (slow delayed rectifier K<sup>+</sup> current),  $I_{K1}$  (inward rectifier K<sup>+</sup> current),  $I_{to}$  (transient outward K<sup>+</sup> current)], calcium (L-type Ca<sup>2+</sup>), and sodium [I<sub>Na</sub> (fast Na<sup>+</sup> current)] channels <sup>5</sup>. In silico modeling methods derived from human data can improve translation potential for TdP risk, and have demonstrated higher or comparable sensitivity, specificity, and accuracy than those obtained in animal studies <sup>12</sup> <sup>13</sup> <sup>10</sup>. For example, *in silico* dynamic modelling was demonstrated to improve the prediction of TdP risk from the interaction between the hERG channel  $(I_{Kr})$  and a multi-ion channel drug <sup>14</sup>. As a constituent of the regulatory landscape, the Comprehensive *In vitro* Proarrhythmia Assay (CiPA) was developed to improve the prediction of arrhythmia by

evaluating selected ion channels:  $I_{Kr}$  (Kv11.1/hERG),  $I_{Ca}$  (L-type; Cav1.2),  $I_{Na}$  (Nav1.5 peak and late current);  $I_{\text{to}}$  (Kv4.3);  $I_{\text{Ks}}$  (Kv7.1), and  $I_{\text{K1}}$  (Kir2.1)<sup>1</sup>. However, currently, as per the International Council of Harmonization (ICH) in the S7B and E14 guidelines, only  $I_{Kr}$  (hERG),  $I_{Ca}$  and  $I_{Na}$  are formally listed as components of the proarrhythmic risk assessment <sup>15</sup> <sup>16</sup> <sup>17</sup> <sup>18</sup>. This study aims to evaluate the impact of different ion channel combinations on proarrhythmic risk assessment when using an *in silico* model. More specifically, outcomes obtained with data from all channels included in the CiPA were compared to AP Duration (APD) outcome obtained from a partial CiPA panel with ion channels commonly included  $(I_{Kr} I_{Ca}$  and  $I_{Na}$ ) in safety assessments. Additionally, the study applied *in silico* modeling to inhibition data recording using manual patch clamp with multiple drugs [cisapride (1  $\mu$ M), terfenadine (1  $\mu$ M), amiodarone (1  $\mu$ M) and verapamil (10  $\mu$ M)]. Since the Sodium (Nav1.5 peak and late current) channels are being considered as one, only 6 channels were evaluated in this paper, instead of 7. First, a single ion channel was tested with the O'Hara Rudy model with an inhibition percentage ranging from 0-100%, followed by testing for a combination of multiple ion channels. Secondly, the APD at 30, 60 and 90% repolarization were evaluated with inhibition ranging from 0 to 100%. The analysis of the APD<sub>90</sub> (action potential duration at 90% repolarization) of multiple combinations of ion channels with different inhibition percentages were also evaluated. Finally, triangulation, the repolarization time from  $APD<sub>30</sub>$  to  $APD<sub>90</sub>$ , was assessed.

#### **2. Materials and Methods**

HEK 293 cells with stable ion channel expression were used in manual whole-cell patch clamp electrophysiological configuration (34  $\pm$  1°C) with protocols as described previously <sup>19</sup>. For the recordings, tyrode solution (external solution) contained (mM): NaCl (137), KCl (4), CaCl<sub>2</sub> (1.8), MgCl<sub>2</sub> (1), Glucose (10), HEPES (10). pH was adjusted to 7.4 with NaOH. The pipette solution (internal solution) contained (mM): K-aspartate (130), MgCl<sub>2</sub> (5), EGTA (5), Na2ATP (4), and HEPES (10) dissolved in Sterile Water for Injection USP. pH was adjusted to 7.2 with KOH. Junction potentials between bath and pipette solutions averaged 10.5 mV and were corrected for RMP measurements only. Borosilicate glass electrodes filled with pipette solution were connected to a patch-clamp amplifier (Ax-opatch 200B; Axon). Electrodes had tip resistances of 2 to 5 MΩ. The O'Hara-Rudy model was applied to manual patch clamp inhibition profiles and the duration of the cardiac action potentials at 90% repolarization (APD<sub>90</sub>) was calculated at a stable pacing rate for single cells at 60 bpm (*i.e.*, basic cycle length of  $1000 \text{ ms}$ )<sup>5</sup>.

The O'Hara Rudy *in silico* model was used to simulate different percentages of ion channel inhibition for 6 different ionic channels (I<sub>Kr</sub>: Kv11.1/hERG; I<sub>K1</sub>: Kir 2.1; I<sub>Ca</sub>: Cav1.2; I<sub>Na</sub>: Nav1.5; I<sub>to</sub>: Kv4.3; I<sub>Ks</sub>: Kv7.1)<sup>5</sup>. The *in silico* model was based on C<sub>++</sub> code provided by the authors that was compiled using the open-source compiler Code::Blocks. Scripts for running simulations were coded in Python (Anaconda distribution, Anaconda inc., Texas) in the Jupyter notebook environment (Jupyter, California).

The simulations included different scenarios with a range of inhibition percentages progressing from 0 to 100% for the six individual channels  $(I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$  and  $I_{to}$ ). The different sets of parameters tested included the percentage of inhibition of the six individual ion channels and a combination of multiple ion channels (six channels together, and 2 combinations of three channels:  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$  and  $I_{K1}$ ,  $I_{to}$ ,  $I_{Ks}$ ). The simulations also included baseline models from the different layers of the ventricles (endocardium (endo), myocardium (mid) and epicardium (epi)). Most graphs in this article display data from the mid (or M) layer which was considered representative of the overall effects of ion channel block, effects on the APD and the most proarrhythmic in terms of EAD (early after depolarization) notably  $2021$ .

The  $APD_{30}$ ,  $APD_{60}$  and  $APD_{90}$  were calculated for every action potential simulated with the different percentages of inhibition. Triangulation was defined as  $APD_{90} - APD_{30}$  for the same layer of the heart (*i.e.*, endo, mid and epi)  $^{22}$ . The total number of simulations was 194 for all the different ion channel combinations that were tested. Inhibition values for all the six CiPA ion channels  $(I_{Kr}, I_{Ca}, I_{Na}, I_{K1}, I_{Ks}, I_{to})$  and for a subset  $(I_{Kr})$ only, I<sub>Kr</sub>, I<sub>Ca</sub>, I<sub>Na</sub> only) were tested with cisapride (1 μM), terfenadine (1 μM), amiodarone (1 μM) and verapamil  $(10 \mu M)$ .

### **3. Results**

### *3.1. Progressive inhibition of single ion channels (IKr, ICa, INa, IK1, IKs, Ito).*

Simulations of single-channel inhibition are shown in Figure 1. The action potential for the myocardium with a progressive inhibition from 0 to 100% is represented for each individual channel. For  $I_{Kr}$  (Figure 1A), the repolarization duration increased with the progressive inhibition toward 100%. At 0% inhibition the end of repolarization was at 457 ms and for 60% inhibition the end of repolarization was at 645 ms. Repolarization duration values with inhibition greater than  $60\%$  (or  $~645$  ms) triggered the development of an arrhythmia (EAD) and these are shown in Figure 1 with an APD simulation curve that did not return to the resting potential of -90 mV. For  $I_{Ca}$  (Figure 1B), at 0% inhibition, APD was 457 ms and APD decreased with increasing inhibition. At 90% inhibition, APD was 401 ms and for 100 % inhibition, the APD increased to 500 ms. The predicted inhibition effect on APD varied across different cardiac tissues layers. The magnitude of effect in absolute values for percent changes from baseline differed between myocardial layers and also between inhibition levels as illustrated for  $I_{Kr}$  (Table 2). For  $I_{Kr}$ , the effects on myocardial layers were greater in the following order (magnitude of effect) Mid > Endo > Epi (Table 2). For  $I_{Na}$  (Figure 1C), from 0 to 80 % inhibition, the APD from the peak to the resting potential was stable. Aberrant action potential waves appeared at 90 and

100% inhibition. For  $I_{K1}$  (Figure 1D), at 0% inhibition, APD was 457 ms and a progressive increase in APD was observed reaching 844 ms at 90 % inhibition. At 100% inhibition, return to the resting potential was very slow. For  $I_{Ks}$  (Figure 1E), APD increased from 457 ms at 0% inhibition to reach 500 ms at 100 % inhibition. Inhibition of  $I_{to}$  alone (Figure 1F) did not have any effect on the predicted APD.

### *3.2. Progressive inhibition of multiple ion channels*

Multiple channel inhibition simulations were performed as seen in Figure 2. At 0% inhibition for all 6 channels or all combinations ( $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$ ,  $I_{to}$ ), the APD was 457 ms (Figure 2A). With 80% inhibition for all channels, APD was prolonged to 1034 ms and from 90 to 100% inhibition, the action potentials were aberrant in nature. The action potential for Figure 2A at inhibition of 90 to 100% had a low amplitude that decrease with higher inhibition, apart from the aberrant action potential no arrhythmia was detected. When the 3 channels that are most frequently tested during drug development were modulated (*i.e.*,  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$  in Fig 2B), at 80% inhibition, APD was increased to 680 ms. Above 80% inhibition for these three currents, the action potential was aberrant, similar to the 6 channels mentioned above. With 80% inhibition for currents  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{\text{Na}}$ , I<sub>Ks</sub>, the duration was 819 ms, (Figure 2 C); however, when inhibition was above 80% no action potential was detected. For a combination of currents less often included in drug development, namely,  $I_{Kr}$ ,  $I_{Ks}$ ,  $I_{K1}$  and Ito, the APD at 50% inhibition increased to 711 ms and an aberrant action potential was generated at 60% inhibition and above (Figure 2 D). When only  $I_{Kr}$  and  $I_{Na}$  were included at 60% inhibition, APD was increased to 676 ms but an aberrant action potential was only generated at 70% inhibition and above (Figure 2E). When  $I_{Kr}$  and  $I_{Ca}$  inhibition was simulated, APD reached 928 ms at 100% inhibition (Figure 2 F).

#### *3.3. Triangulation and action potential duration with the progressive inhibition of multiple ion channel*

The APDs at 30, 60 and 90% inhibition are represented in Figure 3 A, B and C for the different combinations of channels and in Figure 3 D for the  $I_{Kr}$  current alone. The APD<sub>90</sub> for the  $I_{Kr}$  inhibition was 575.3 ms, and when inhibition reached 70%, a predicted arrhythmia developed. The APD<sub>60</sub> and APD<sub>90</sub> values at 60% ion channel inhibition for  $I_{Kr}$ ,  $I_{Ca}$ , and  $I_{Na}$  (Figure 3 B),  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$  and  $I_{Ks}$  (Figure 3 C) and  $I_{Kr}$  (Figure 3 D) were shorter in duration than the 6-channel combination  $(I_{Kr}, I_{Ca}, I_{Na}, I_{K1}, I_{Ks}, I_{to})$ . At 80 % inhibition, APD for the 6-channel combination was increased (899.3 ms) and was longer than the other combinations: 594.8 ms for  $I_{Kr}$ ,  $I_{Ca}$ , and  $I_{Na}$  (Figure 3 B), and 734.3 ms for  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$  and  $I_{Ks}$  (Figure 3 C).

The APD<sub>90</sub> at different inhibition percentages as well as new combinations of channels  $(I_{Kr}, I_{Ca}, I_{Na}, I_{K1}; I_{Kr}, I_{Ca})$ I<sub>Ca</sub>, I<sub>Na</sub>, I<sub>to</sub>; I<sub>K1</sub>, I<sub>Ks</sub>, I<sub>to</sub> and I<sub>Kr</sub>, I<sub>K1</sub>, I<sub>Ks</sub>, I<sub>to</sub>) are presented in Figure 4. All combinations of channels had an increased APD as the inhibition percentage increased. The  $I_{Kr}$  alone and the  $I_{Kr}$ ,  $I_{K1}$ ,  $I_{Ks}$ ,  $I_{to}$  combinations had an arrhythmogenic action potential from 50 % and 70% inhibition, respectively. As expected, the combination of  $I_{Kr}$ ,  $I_{K1}$ ,  $I_{Ks}$ , and  $I_{to}$  potassium channels induced an increase in APD at a faster rate than other ion channel combinations or when compared to the 6-channel combination. At 40% inhibition of potassium channels, APD was at 614.2 ms compared to 508.2 ms for the 6-channel combination.

Finally, action potential triangulation (Figure 5) was calculated. Triangulation when considering the potassium channels only was qualitatively comparable to APD behavior as a function of inhibition percentage (Figure 4). Triangulation values for the combination of ion channel currents  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$  increased at a lower percentage of inhibition than for  $I_{Kr}$  alone. The inhibition of  $I_{K1}$ ,  $I_{Ks}$ ,  $I_{to}$  had the least impact on triangulation (121.2 ms at 0% inhibition and 188.3 at 100% inhibition).

# *3.4. Evaluating Drug Effects and Action Potential Duration at 90% Repolarization using the O'Hara-Rudy Model*

O'Hara Rudy *in silico* modeling was applied to investigate the effects of four drugs (cisapride (1 μM), terfenadine (1  $\mu$ M), amiodarone (1  $\mu$ M) and verapamil (10  $\mu$ M)) on the APD<sub>90</sub>. The inhibition values for the different drugs are presented in Table 1. The results were represented in Figure 6. APD $_{90}$  was evaluated for the three cardiac layers (endo, mid and epi) for each drug and tested for both a single ion channel current  $(I_{Kr})$  and a combination of ion channel currents  $(I_{Kr}, I_{Ca}, I_{Na}$  and  $I_{Kr}, I_{Ca}, I_{Na}, I_{K1}, I_{Ks}, I_{to})$ . When modelling inhibition of  $I_{Kr}$ only, both the endo and epi layers exhibited a similar increase in APD90. Among the drugs tested, cisapride showed the highest increase, with APD<sub>90</sub> values of 675 ms and 575 ms for endo and epi layers, respectively. Verapamil followed with APD<sup>90</sup> values of 665 ms and 569 ms, while terfenadine exhibited values of 640 ms and 553 ms. In contrast, amiodarone exhibited the lowest increase, with APD<sub>90</sub> values of 411 ms and 379 ms for the endo and epi layers, respectively. In the mid layers, only amiodarone resulted in a prolonged APD<sub>90</sub> of 575 ms. However, the other drugs induced early afterdepolarization (EAD), leading to the development of APD changes indicative of ventricular arrhythmias.

Investigating the effects of different combinations of ion channel currents ( $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$  and  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$ , Ito) on the endo and epi layers, exhibited similar increases in APD with multiple drugs. For the first combination, verapamil induced APD prolongation reaching 608 ms and 535 ms in the endo and epi layers, respectively. In the second combination, the increase was even more pronounced with values of 690 ms and 618 ms. Cisapride showed comparable increases in both the first combination (595 ms and 530 ms) and the second combination (655 ms and 594 ms). Terfenadine yielded similar effects as in the first combination (575 ms and 512 ms) and for the second combination (609 ms and 543 ms). Finally, amiodarone had the lowest impact of change in the APD, resulting in an increase of 389 ms and 354 ms for the first combination, and 399 ms and 361 ms for the second combination.

The mid layers for  $I_{Kr}$ ,  $I_{Ca}$  and  $I_{Na}$  ion channel combination exhibited severe APD<sub>90</sub> prolongation in all the drugs tested, with verapamil showing the greatest increase of all drugs. When tested, verapamil prolonged the  $APD<sub>90</sub>$  to a duration of 3612 ms. Cisapride and terfenadine showed similar  $APD<sub>90</sub>$  increases (1532 ms and 1490 ms), respectively. In contrast, amiodarone showed a limited increase compared to other drugs with a value of 519 ms. As for the  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$ ,  $I_{to}$  ion channel current combination only amiodarone resulted in a prolonged APD<sup>90</sup> of 540 ms. However, the other drugs tested induced EADs and resulted in development of ventricular arrhythmias.

When using inhibition data from  $I_{Kr}$ ,  $I_{Ca}$  and  $I_{Na}$ , a higher increase in APD<sub>90</sub> was noted for the endo and epi layers compared to *in silico* modelling using input only from the  $I_{Kr}$  channel. APD<sub>90</sub> modelled from data obtained from  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$  and  $I_{to}$  resulted in a larger increase in APD<sub>90</sub> for the same layers compared to the aforementioned combination.

In contrast, for the mid myocardial layer, using input from a combination that includes  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$  showed a much more pronounced prolongation of APD<sup>90</sup> compared to the 6 ion-channel combination. These observations are consistent with the predicted outcome depicted in Figure 6, particularly in the middle panel representing the mid myocardial layers.

### **4. Discussion**

Early *in vitro* screening for I<sub>Kr</sub> (hERG) blocking effects is commonly conducted for small molecules to help identify any potential prolongation of the QT interval which can be associated with the development of TdP <sup>23 24</sup>. When ICH S7B was first published in 2005,  $I_{Kr}$  was the only *in vitro* ion channel assessment required <sup>15</sup>; however, subsequent guidance documents that have been released include considerations for the testing of the L-type calcium ( $I_{Ca}$ ) and late sodium channels ( $I_{Na}$ ) <sup>17 25</sup>. *In silico* modeling offers an opportunity to integrate *in vitro* data from individual ion channels into a single outcome to assess proarrhythmic risks <sup>26</sup> but concerns related to the value of *in silico* results obtained from a subset of ion channels have historically limited the use of this analysis in drug development. In this manuscript, we illustrated the use and relative value of *in silico*  modelling using inhibition data from a limited number of ion channels.

The CiPA initiative was established to develop an innovative paradigm that could be used to assess proarrhythmic risk. As a regulatory based initiative, CiPA was developed to standardize and expand the safety testing strategies related to drug-induced delayed ventricular depolarization and eventually TdP. CiPA was innovative as it utilized new technologies and an expanded understanding of TdP mechanisms that extended beyond hERG (I<sub>Kr</sub>) block alone. The four components of CiPA are 1) an *in vitro* assessment of a drug's effects on multiple ion currents, 2) *in silico* modeling to assess the proarrhythmic risk, 3) *in vitro* effect on human stem cell derived ventricular cardiomyocytes and finally 4) *in vivo* electrocardiogram biomarkers in phase I clinical trials  $427$ . While components 1), 3) and 4) have been broadly discussed in scientific publications and within industry forums, there is limited information on the implementation of *in silico* testing strategies in drug development. This situation may be related to the role that hERG has played as a predominant mechanism for the development of drug-induced ventricular arrhythmias over in the last three decades. Indeed, hERG is the cardiac channel that is most often blocked by small chemical pharmaceutical agents, followed by Nav 1.5-late and Cav  $1.2^{28}$  <sup>14 29</sup>. Furthermore, drugs that block Cav 1.2 or Nav 1.5-late calcium, sodium channels - at equal or greater concentrations required to block hERG will reduce the risk for the development of TdP arrhythmias <sup>28 30 26</sup>. The drug development industry has deployed considerable efforts to avoid the clinical development of compounds that block any cardiac ion channel, but specifically to avoid any risk for the blockade of hERG (IKr) and resulting TdP liability. The *in silico* data presented herein highlights that only the combination of all the potassium channels tested  $(I_{Kr}$ ,  $I_{K1}$ ,  $I_{Ks}$ , and  $I_{to}$ ) results in the development of ventricular arrhythmia at an ion channel inhibition level that is lower than the  $I_{Kr}$  alone. The progressive inhibition for the 6-channel combination was the most resilient to arrhythmia development even though it had the longest APDs determined in this study. Combined blockade of these depolarizing ion channels in the heart reduces the potential for EAD generation <sup>31</sup> <sup>30</sup> <sup>26</sup> and proarrhythmic risk (TdP) in the presence of a prolonged APD.

Triangulation is the repolarization time from APD<sup>30</sup> to APD<sup>90</sup> and it can be used as a biomarker of proarrhythmia <sup>32</sup>. This repolarization period creates a window during which EADs can occur. Blocking multiple channels in cardiomyocytes such as sodium, calcium and potassium channels can prevent the initiation of arrythmia that would be observed when selectively blocking the hERG channel  $^{33}$ . Inhibition of I<sub>Kr</sub> increases triangulation and the risk for arrhythmia. It has been previously shown that the inhibition of  $I_{Kr}$  and  $I_{Ks}$  was more arrhythmogenic than  $I_{Kr}$  channel inhibition alone  $34$  but the evaluation of drug effects on  $I_{Ks}$  is not generally included during early drug safety profiling. The fundamental rationale from quantifying QTc on ECG is related to its correlation with Phase 3 of the action potential when EADs can occur. When multi-channel inhibition is present or even when selective hERG block is identified, *in silico* modelling can be used to assess triangulation as an early indication of the potential for a new chemical compound to exhibit proarrhythmic risk.

The differences in APD<sup>90</sup> prolongation threshold prior to predicting proarrhythmic effects between selective IKr and multi-ion channel blocking effects highlight the limitations of using *in silico* APD<sup>90</sup> as a primary biomarker for quantifying the proarrhythmic risk of a compound<sup>7</sup>. The magnitude of APD<sub>90</sub> prolongation alone does not fully inform on the proarrhythmic risk predicted by the *in silico* model. While most pharmacologists aim to develop safe compounds that will not inhibit cardiac ion channels, there are still several compounds under development that exhibit various profiles, ranging from selective to multi-ion channel inhibitory effects.

The early electrophysiological screening of pharmaceutical compounds often includes a limited cardiac ion channel panel usually comprised of  $I_{Kr}$ ,  $I_{Ca}$  and  $I_{Na}$  only <sup>16 15 17</sup>. Selection of partial patch clamp panels is primarily driven by considerations related to probability and affordability. The hERG potassium channel is widely acknowledged for its notable pharmacological promiscuity, making it a pharmacological target that is frequently encountered by safety pharmacologists  $35$ . The hERG channel's ability to engage with a diverse array of medications can be attributed to its distinctive ligand-binding site configuration, its hydrophobic nature, and the large channel vestibule <sup>36 37</sup>. It had been estimated that up to 60% of drugs in development exhibit some level of hERG block <sup>38 39</sup>. Although sodium and calcium channel blocks are less common, they still arise with sufficient frequency. In contrast, compounds that block the additional ion channels that are commonly involved with *in silico* modelling (i.e.  $I_{K1}$ ,  $I_{Ks}$  and  $I_{to}$ ) are relatively scarce. The above probabilities often direct the ion channel selection for early-stage *in vitro* testing.

When the inhibition results justify further assessments and evaluation, *in silico* modeling of drug effects using these three ionic currents can provide a simple, yet relevant, analysis method that allows for the use of individual ion channel data in an integrated risk evaluation, as the marginal contribution to ADP<sub>90</sub> values from the other three currents (*i.e.*,  $I_{\text{to}}$ ,  $I_{\text{Ks}}$  and  $I_{\text{K1}}$ ) remains minor when taken individually. The presented results underscore the cumulative advantage of incorporating all six ion currents included in CiPA into *in silico* modeling compared to a partial panel. *In silico* models represent a theoretical aggregated response to compound effects on the APD and can describe the potential for development of proarrhythmic effects. Proceeding with *in silico* modeling using only the three primary cardiac ion currents commonly tested in early development only reveals part of the value provided by *in silico* modeling but can still contribute to an integrated risk assessment prior to the conduct of more complicated *in vitro* (cardiac left ventricular wedge preparation) or *in vivo* (telemetry dog study) cardiovascular assays. However, as has been shown, *in silico* modelling with I<sub>Kr</sub>, I<sub>Ca</sub> and  $I_{Na}$  may overestimate compound safety, since  $I_{Ca}$  and  $I_{Na}$  counterbalance the APD prolonging effects of  $I_{Kr}$ . Additional potentially exacerbating cardiac currents  $(i.e., I_{to}, I_{Ks}$  and  $I_{K1})$  are not usually included. As we know, IKr still provides the most critical contribution to ventricular repolarization and proarrhythmic risk and should remain the cornerstone of drug induced TdP testing.

Novel *in silico* models have been developed to address some of the limitations of the O'Hara-Rudy model including the balance of ion channels <sup>40</sup>. *In silico* models have been reported to show a degree of prolongation and arrhythmia occurrence in excess of what is observed in *in vitro* tissues and QTc<sup>41</sup>. The current manuscript used 10% inhibition increments which represents a potential limitation of the analysis presented. More granular simulations with 1% inhibition increments may be valuable in the future when considering scenarios with drugs that are close to balanced blockers. In addition, some compounds have direct or indirect effect heart rate and *in silico* modelling at different cycle length may represent another opportunity to develop future testing paradigms early in drug development as *in vitro* assays may already inform on potential chronotropic effects of tested compounds.

The context of use for the *in silico* model is its application in the scenario of drug development. One of the principal components is to evaluate the TdP risk. TdP, an infrequent form of ventricular tachycardia, manifests as gradual alterations in QRS complexes on an electrocardiogram, accompanied by QTc prolongation. This interval prolongation of the QTc is associated with the potential for sudden cardiac death. The lengthening of repolarization induced by drugs elevates the risk of critical arrhythmias like TdP. No specific limit has been established for QTc prolongation to cause TdP, having a QTc exceeding 500 milliseconds amplifies the risk by two to three time, with a 5% to 7% escalation for each 10-ms increase. Numerous drugs have the capacity to induce QT prolongation and/or TdP, either independently or in situations involving drug interactions<sup>42</sup>.

In drug development, the potency for hERG block is typically used for early screening of candidate drugs in development to mitigate the risk of OT prolongation. The IC<sub>50</sub> values for hERG block are compared to predict or measure maximal plasma drug concentrations (Cmax). This can allow for the calculation of a predictive value (IC $_{50}/C$ max), referred to as the hERG safety margin.  $^{43}$ .

TQT studies are recognized for their good specificity (low false-positive rate) but relatively poor sensitivity (higher false-negative rate), indicating their capability to accurately identify drugs that do not have a significant effect on the QTc interval (low false-positive rate). <sup>44 45</sup>.

The exclusion of a positive compound is often associated with its role as a blocker of the hERG channel. There are exceptions, such as hERG inhibitors that do not induce Torsades de Pointes (TdP), and drugs that may cause TdP without being potent hERG inhibitors. On the other hand, a multi-ion channel blocker has the ability to inhibit the hERG channel. Because of its simultaneous impact on sodium and calcium channels, it may lead to a less pronounced increase in the QTc interval. In vitro studies often encounter challenges in accurately evaluating the impact of drugs acting as multi-ion channel blockers <sup>46</sup>.

### **5. Conclusions**

Our results confirm that manual patch clamp inhibition profiles can provide high quality input for use in *in silico* modeling and quantitatively predicts cardiomyocyte APD changes and consequently QT prolongation. The O'Hara-Rudy model, using the six cardiac ion currents proposed for CiPA, predicted changes in cardiac APD and consequently, ECG effects. The use of a partial ion channel panel (*i.e.*,  $I_{Kr}$  only or  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$  only) illustrates the primary contribution of  $I_{Kr}$  in APD estimation with this model.

These findings emphasize the importance of considering the specific combination of ion channels that should be evaluated and the effects they have on the different layers of the heart when evaluating the effects of drugs on APD. The interactions between various channels and cardiomyocyte layers play a crucial role in determining the overall electrophysiological behavior of the heart and highlights the complexity of ventricular arrhythmia mechanisms with various contributions from relevant ion currents as shown by the data herein.

Manual patch clamp data obtained during drug development is readily available for use with *in silico* modeling methods and can be considered to generate pharmacologically relevant APD data even when only a subset of the cardiac ion channels are tested. While the O'Hara-Rudy *in silico* model, using the 6 most important cardiac ion currents (*i.e.*,  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$ ,  $I_{to}$ ), yielded the expected results relative to expected drug effects, *in silico* modelling with data from a combination of channels or even a single channel (*i.e.*, I<sub>Kr</sub>) provides valuable results that can be used to estimate the risk of drug-induced ventricular proarrhythmia.

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### **Figures and legends**

## **Table 1**

**Fraction of inhibition in percentage (%) for different drugs such as cisapride, terfenadine, amiodarone**  and verapamil, at different concentrations (1 to 10  $\mu$ M) for the tested channels;  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$ ,  $I_{to}$ 



## **Table 2**

**Action potential duration changes in percentage (%) from baseline for myocardial layers (endocardium, mid-myocardium and epicardium) after individual ion current inhibition (IKr, ICa, INa, IK1, IKs, Ito)**





Complete action potential cycles with different inhibition percentages (0 to 100%), for cardiac ion channel currents derived from the mid myocardial layer. **A**:  $I_{Kr}$ ; **B**:  $I_{Ca}$ ; **C**:  $I_{Na}$ ; **D**:  $I_{K1}$ ; **E**:  $I_{Ks}$ ; **F**:  $I_{to}$ .



Action potential cycles with different inhibition percentages (0 to 100%) for selected cardiac current combinations examined at the mid myocardial layer. A: 6 channels ( $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{K2}$ ,  $I_{K3}$ ,  $I_{Ca}$ ,  $I_{Na}$ ;  $C: I_{Kr}$ , ICa, INa, IKs; **D**: IKr, IKs, IK1, Ito; **E**: IKr, INa; **F**: IKr, ICa.



Ion channel inhibition combinations and single-channel inhibition at different percentages (0 to 100%). A: I<sub>Kr</sub>,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$ ,  $I_{to}$ ;  $B$ :  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ;  $C$ :  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{Ks}$ ;  $D$ :  $I_{Kr}$ .



Ion channel current inhibition (0 to 100%) for different combinations or single current using the action potential duration at 90%. The 6 channels include the following currents  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$ ,  $I_{to}$ . The asterisk (\*) represents an arrhythmia.



Ion channel inhibition (0 to 100%) combinations using triangulation  $(APD<sub>90</sub> - APD<sub>30</sub>)$ . The 6-channel combination is represented by the following currents:  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{Ks}$ ,  $I_{to}$ . The asterisk (\*) represents an arrhythmia; those values are abnormal.



Ion channel inhibition combinations including  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ , and  $I_{Kr}$ ,  $I_{Ca}$ ,  $I_{Na}$ ,  $I_{K1}$ ,  $I_{K2}$ ,  $I_{to}$ , as well as the singlechannel current  $I_{Kr}$ , in different layers of the heart (endo, mid, and epi) for the measurement of APD<sub>90</sub>. The control condition is depicted in gray, while cisapride  $(1 \mu M)$  is represented in blue, terfenadine  $(1 \mu M)$  in orange, amiodarone (1 μM) in green, and verapamil (10 μM) in red. The absence of a line for a drug indicates the presence of early afterdepolarization, which can lead to the development of ventricular arrhythmias.

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