Models of the cardiac L-type calcium current: a quantitative comparison

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Abstract

The L-type calcium current (I_{CaL}) plays a critical role in cardiac electrophysiology, and models of I_{CaL} are vital tools to predict arrhythmogenicity of drugs and mutations. Five decades of measuring and modelling I_{CaL} have resulted in several competing theories (encoded in mathematical equations). However, the introduction of new models has not typically been accompanied by a data-driven critical comparison with previous work, so that it is unclear where predictions overlap or conflict, or which model is best suited for any particular application. We gathered 71 mammalian I_{CaL} models, compared their structure, and reproduced simulated experiments to show that there is a large variability in their predictions, which was not substantially diminished when grouping by species or other categories. By highlighting the differences in these competing theories, listing major data sources, and providing simulation code, we have laid strong foundations for the development of a consensus model of I_{CaL}.

Contents

Introduction

The "long-lasting" or L-type calcium current (I_{CaL}) is an ionic current found in cardiomyocytes, neurons, endocrine cells, and other cell types throughout the body (Striessnig et al., 2014). It plays a crucial part in critical functions such as hormone secretion, regulation of gene expression, and contraction of cardiac and smooth muscle (Hofmann et al., 2014). Its critical role in cardiac cellular electrophysiology has led to extensive modelling efforts, and a large number of models of cardiac I_{CaL} electrophysiology have been published since the 1970s. Incorporated into models of the cardiac action potential (AP), I_{CaL} models have a long and successful history of application in fundamental electrophysiology research (Noble and Rudy, 2001). More recently, they have been used or proposed for use in drug safety assessment (Mirams et al., 2012) and risk stratification in cohorts with ion channel mutations (Hoefen et al., 2012). Choosing an I_{CaL} model for such safety-critical applications is not an easy task, as models are spread out over the literature, vary widely in their structure and assumptions, and are often published in a paper form which does not lend itself to quantitative comparison without considerable effort (Cooper et al., 2011). On a more fundamental level, each model of I_{CaL} represents a testable theory of its physiology, and the existence of so many competing theories reveals both gaps in our knowledge and an urgent need for their comparison and synthesis. In this study, we take the first major steps to facilitate a critical reassessment by the community, by collecting I_{CaL} models, analysing their qualitative differences, and providing quantitative comparisons based on simulations with freely reusable code. We start with a brief description of I_{CaL} physiology and the common structure of its models.

The L-type calcium channels through which I_{CaL} flows consist of a pore formed by four α_1 subunits and one each of the auxiliary subunits β and $\alpha_2\delta$ (Dolphin, 2016). The most common α_1 subunit in Purkinje fibres and ventricular and atrial cardiomyocytes is $Ca_V1.2$ (encoded by the gene *CACNA1C*), while $Ca_V1.3$ (*CACNA1D*) is more prevalent in the sinoatrial node (SAN) and atrio-ventricular node (AVN) (Gaborit et al., 2007; Zamponi et al., 2015). Electrically, I_{CaL} is characterised by fast, membrane voltage (V_m)-dependent activation at relatively depolarised potentials (around $0\,\mathrm{mV}$) and slower inactivation that also depends on the V_m (voltage-dependent inactivation, VDI) and on the intracellular calcium concentration (calcium-dependent inactivation, CDI). Although predominantly carried by calcium ions, smaller potassium and sodium components have also been reported (Hess et al., 1986) and included in models.
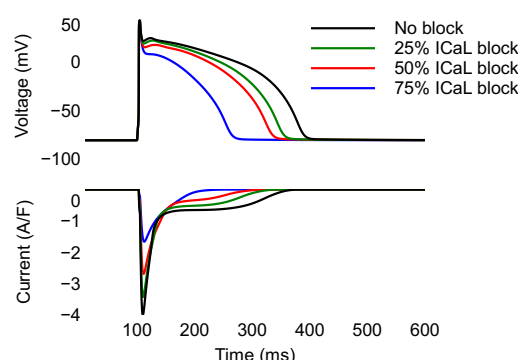

Figure 1: Blocking the L-type calcium current (I_{CaL}) shortens the AP duration. **Top**: AP and **Bottom**: I_{CaL} during 1 Hz simulation of the AP model by Grandi et al. (2010).

In ventricular and atrial cardiomyocytes, I_{CaL} is the major inward current responsible for maintaining the "plateau" of the AP (Catterall, 2011). Figure 1 shows the shortening of the AP duration when the I_{CaL} is blocked in the AP model by Grandi et al. (2010). The calcium influx during the plateau phase

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initiates the process of calcium-induced-calcium release (CICR): calcium flowing through L-type calcium channels triggers a further (much larger) release of calcium from the sarcoplasmic reticulum (SR), the major calcium store inside the cell. The resulting increase of calcium concentration in the cytosol allows formation of cross-bridges between myosin heads and actin filaments, causing contraction (Eisner et al., 2017).

The crucial role of calcium channels in maintaining healthy cardiac function is borne out by clinical evidence. For example, reduction of the expression of the $Ca_V 1.2$ α_1 subunit by less than half can lead to heart failure (Goonasekera et al., 2012). Mutations in *CACNA1C* and in its subunits have been linked to Brugada syndrome, Timothy's syndrome, arrhythmia, and structural heart defects (Hofmann et al., 2014).

As a result of its role in cardiac physiology, the L-type calcium channel is an important target for pharmacological antiarrhythmic therapy. For example, nifedipine, verapamil, and diltiazem are known to inhibit I_{CaL} (Ortner and Striessnig, 2016). Conversely, unintended pharmacological modulation of I_{CaL} may lead to drug-induced arrhythmias or other adverse cardiovascular effects. Initiatives like the comprehensive *in vitro* proarrhythmia assay (CiPA) therefore take I_{CaL} into account when attempting to predict or evaluate pro-arrhythmic risk (Ridder et al., 2020).

Models of a cardiac calcium current first appeared in the early 1970s (Bassingthwaithe and Reuter, 1972; McAllister et al., 1975), only a few years after the first calcium current recordings in cardiac preparations. Although Bassingthwaithe and Reuter (1972) confidently referred to it as a "calcium current whose role is primarily in the maintenance of the plateau [and in] regenerative depolarisation in low-sodium medium", the exact nature of the current and the species it was carried by was controversial at the time, so that the more cautious names "secondary inward" and "slow inward current" were more commonly used (Fozzard, 2002).

Although the complexity of I_{CaL} models has increased over time (keeping pace with new discoveries about the current and its role in cardiac function), all models we assess in this manuscript can be expressed in a common form:

$$I_{CaL} = (\bar{g} \text{ or } \bar{P}) \cdot O(V_m, [\text{Ca}^{2+}], t) \cdot D(V_m, [\text{Ca}^{2+}]). \tag{1}$$

Here, O is the fraction of open channels (or the *open probability* of a single channel). The time-varying behaviour, i.e. the *kinetics* (or *gating*), of the channel(s) is captured by O, which is voltage- and time-dependent and may also depend on $[\text{Ca}^{2+}]$. The term D represents the "driving term" accounting for the electrochemical forces driving the ionic movement. D can depend on V_m as well as the ionic concentrations on either side of the membrane. The current is scaled by either a maximal conductance $\bar{g}$ or a maximum permeability $\bar{P}$, depending on the choice of driving force model (see 'Driving force'). Conductance and permeability are functions of the total number of channels in the membrane (Schulz et al., 2006), which can vary over longer periods (hours to days); however, they are treated as constants in all of the models we surveyed.

For many ionic currents, the driving force at physiological membrane potentials is well described by an Ohmic driving force and a reversal potential given by the Nernst equation (see 'Driving force'), so that most modelling efforts are concentrated on the time-variant (and often transient) kinetic effects described by the O term. For I_{CaL}, however, even the earliest publications showed that these assumptions are problematic, which led to the introduction of more complex driving terms, but also to the postulation of intracellular subspaces with elevated $[\text{Ca}^{2+}]$ (Bassingthwaithe and Reuter, 1972) and to I_{CaL} current formulations with sodium and potassium components (Reuter and Scholz, 1977; DiFrancesco and Noble, 1985). When gating terms began to include CDI (DiFrancesco and Noble, 1985), this led modellers to

the inclusion of intracellular subspaces in their models (often connected to the SR) where $[Ca^{2+}]$ could differ from the 'bulk' cytosolic level (Nordin, 1993). As a result, comparing models of I_{CaL} requires consideration of the modellers' assumptions about channel localisation and cell structure in addition to the driving force and gating. Examples of early (McAllister et al., 1975) and more recent model equations (Faber and Rudy, 2000) can be viewed in the online repository accompanying this paper, at https://github.com/CardiacModelling/ical-model-comparison.

In this study we present an overview of the models that have been used in cardiac, mammalian I_{CaL} modelling to date. We first describe the process by which we have identified models to be included in the study. We classify 71 of such models identified by their origins, the assumptions made by their authors about channel localisation and calcium-dependent effects, and the equations for their gating and driving force. We then compare the 60 models for which we could find the full equations by simulating the application of several experimental protocols. These include voltage-clamp protocols for activation, inactivation, and recovery, as well as an AP-clamp protocol and a protocol in which AP and calcium transient (CaT) are both clamped. To understand the observed variability in predictions, we then test whether we can explain quantitative model differences by grouping models according to the qualitative aspects identified earlier. Finally, we discuss the implications of our findings for simulation studies including I_{CaL} and for the process of building new I_{CaL} models.

Part 1. Qualitative comparison

Literature survey

To find papers that contained models of I_{CaL} we searched on PubMed for the term "L-type calcium channel". Because many I_{CaL} models are presented as part of a larger modelling effort, we also included the term "cardiac cell model", and scanned lists of models such as those given in Noble et al. (2012) and Heijman (2012). To restrict our search, we only included I_{CaL} models that were presented by the authors as representing I_{CaL} from healthy human or mammalian cells.

Next, we selected modern calcium models only where the authors indicated that it was an L-type current. Older models of "calcium current" and "slow" or "second inward" current were included if they modelled atrial, ventricular, or Purkinje cells, in which L-type is the dominant calcium current (Gaborit et al., 2007). The models included this way were by Bassingthwaithe and Reuter (1972), McAllister et al. (1975), Beeler and Reuter (1977), DiFrancesco and Noble (1985), Hilgemann and Noble (1987), and Noble et al. (1991). Some older models were excluded if they modelled the sino-atrial node, in which the dominant calcium current is of the T-type (Mesirca et al., 2014).

Some studies included several model variants. The models by Pandit et al. (2001), Ten Tusscher et al. (2004), Ten Tusscher and Panfilov (2006), O'Hara et al. (2011), and Tomek et al. (2019) have epi-, endo-, or mid-myocardial variants but the I_{CaL} kinetics are the same. The epicardial cell model was chosen for these models. Similarly, the apical cell model was chosen for Bondarenko et al. (2004). The I_{CaL} kinetics varies among the different versions presented for Inada et al. (2009), Paci et al. (2013), and Varela et al. (2016), for which we chose the atrio-nodal, atrial-like, and right-atrial model respectively.

The next selection was based on the model equations. Models were included in our overview if they introduced changes to equations in a pre-existing model, or if they included reparameterisation of equations determining either the open probability or driving force. We did not include models that changed only the maximum conductance or permeability. Models for which the equations were not (fully) given in the publication or an online addendum were also excluded in this step (9 models in total), as were models for which the equations were suspected to contain typesetting errors (1 model). Due to its historic importance, an exception was made for Bassingthwaithe and Reuter (1972) for which the published equations did not match the accompanying figures. This model is included in our qualitative, but not quantitative, analysis.

Finally, studies that calculated the current by considering the sum of all individual I_{CaL} channels stochastically were only included for qualitative analysis. These included the studies by Greenstein and Winslow (2002), Restrepo et al. (2008), Hashambhoy et al. (2009), and Nivala et al. (2012). The studies by Hinch et al. (2004), Greenstein et al. (2006), Asakura et al. (2014), and Himeno et al. (2015) described I_{CaL} using a model in which the gating was linked to the ryanodine receptor, and were also included for qualitative analysis only.

Applying these criteria we found a total of 71 distinct I_{CaL} models, spanning more than five decades of research.

Model provenance

Models are not created in isolation, but inherit ideas, equations, and parameter values from previous models. Figure 2 presents a tentative 'phylogeny' of I_{CaL} models, showing how the models that are in use today were derived from one another over time. To establish these relationships, we searched the model publications for explicit references to parent models. In some cases (e.g. Rasmusson et al. (1990))

the parent models did not meet the selection criteria used in this study, which is indicated in the figure by a dashed line. In other cases (e.g. Lindblad et al., 1996; Demir et al., 1999; Bondarenko et al., 2004), the parent model was not mentioned explicitly but could be inferred from the equations.

In constructing the figure, we attempted to limit each model to a single parent where possible. This is a simplification, and the figure should not be read as a statement on originality. For the models up to around 1995 it is likely that each model 'inherited' in some way from all other models published up to that time.

The phylogeny shows that many models have encountered species switches over the course of their development. For example, Grandi et al. (2010) (human) inherits from Shannon 2004 (rabbit), Luo-Rudy 1994 (guinea pig), and Rasmusson 1990 (bullfrog). Similarly, the histories of the O'Hara et al. (2011) and Paci et al. (2013) models also contain several species switches. Note that this does not necessarily suggest re-use of data, as models are frequently re-parameterised to new data sets. However, inheritance of parameter values (and thereby indirectly of data sources) is also very common in electrophysiology models (Niederer et al., 2009).
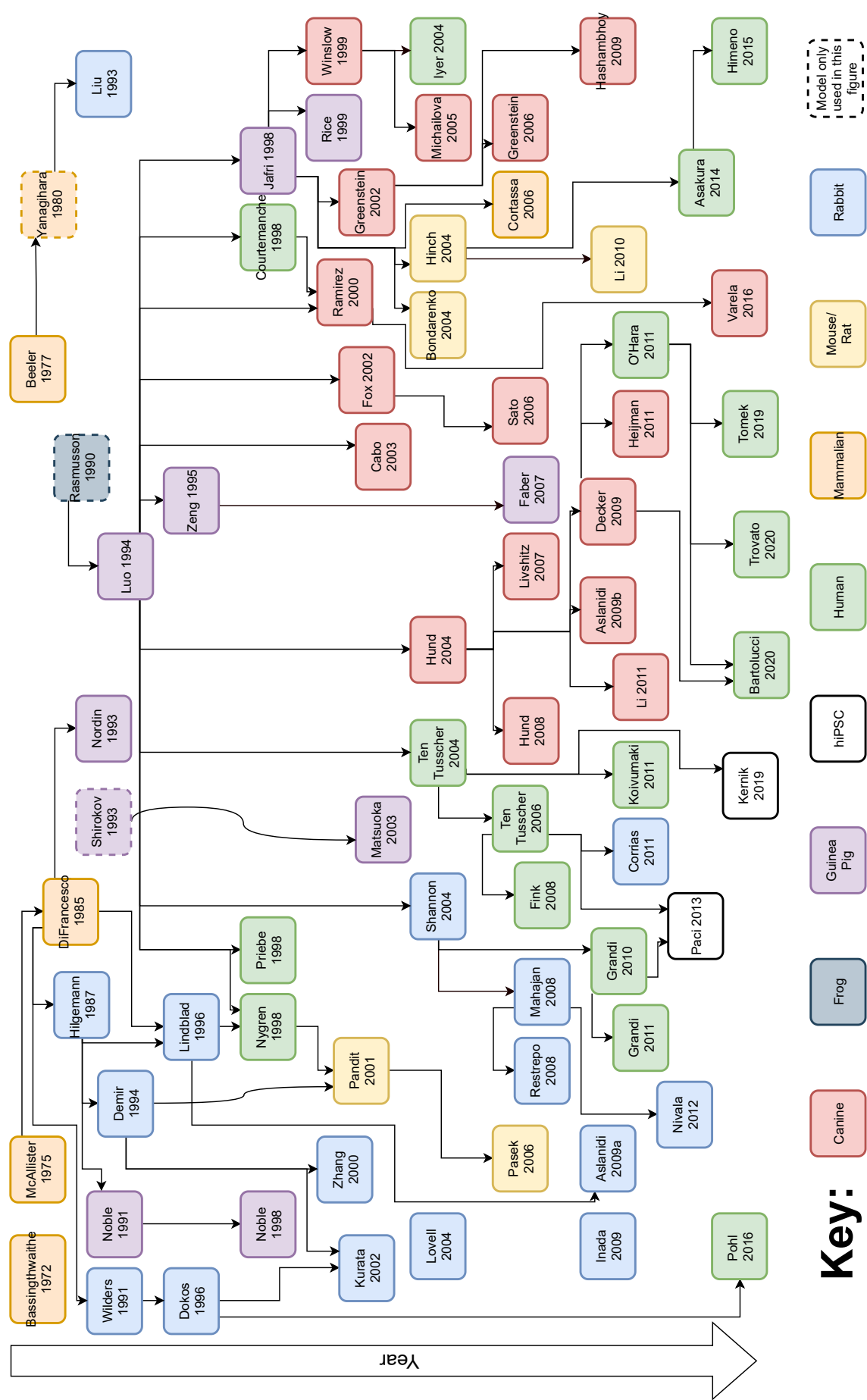
Figure 2: A schematic (and simplified) representation of human and mammalian I_{CaL} model development from 1975 to present. The key describes the species associated with each model.

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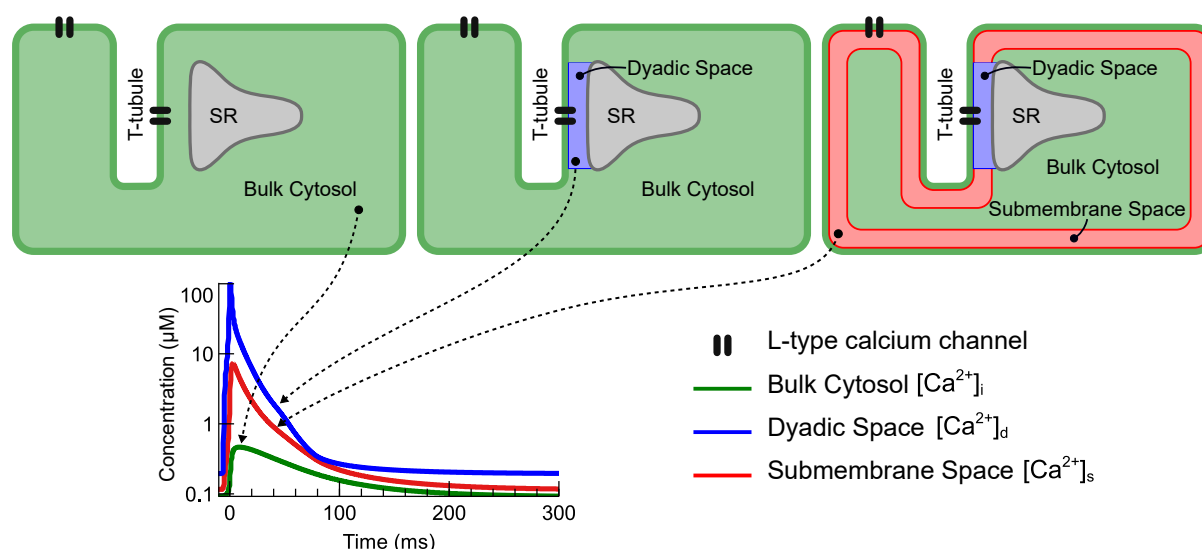## Local $[\text{Ca}^{2+}]$ and other variables

Figure 3: Schematic representations of a cardiomyocyte illustrating three common models of subcellular subspaces and L-type calcium channel localisation. In small subspaces, $[\text{Ca}^{2+}]$ can differ from the bulk cytosolic concentration by orders of magnitude, as illustrated in the lower panel, which shows calcium transients from the Grandi et al. (2010) action potential model at 1 Hz simulation.

The calcium concentration at the intracellular side of the I_{CaL} channel is known to affect the channel's gating, as well as the electrochemical force. Modellers as early as Bassingthwaithe and Reuter (1972) suggested that the size of these effects is inconsistent with the low (micromolar) calcium concentration of the 'bulk' cytosol. Instead, many action potential (AP) models have divided the cell into smaller volume 'subspaces' in which calcium ions, carried in by I_{CaL} or released from the SR, can cause $[\text{Ca}^{2+}]$ to transiently rise to much higher levels than are seen in the bulk cytosolic space.

Figure 3 shows three commonly used subspace configurations. Here, we use $[\text{Ca}^{2+}]_i$ to denote the bulk cytosolic concentration, $[\text{Ca}^{2+}]_s$ for the submembrane space concentration, and $[\text{Ca}^{2+}]_d$ for the dyadic space concentration. In the simplest type of AP model, shown on the left, there are no subspaces and I_{CaL} flows directly into the bulk cytosol (e.g. DiFrancesco and Noble (1985)). The second type of cardiac model adds a 'dyadic' or 'junctional' space, located near the t-tubules adjacent to the SR. In this illustration, I_{CaL} channels are connected to the dyadic space and also directly to the bulk cytosol (as some cardiac models have a small fraction ($\sim$10%) of I_{CaL} flowing directly into the cytosol, e.g. Tomek et al. (2019)). The third type of cardiac model retains the dyadic space, but adds a 'submembrane' or 'subsarcolemmal' space just below the remainder of the cell membrane, so that I_{CaL} flows either into the dyadic or the submembrane space. An example of this configuration, including compartment sizes and experimental references, is given in Shannon et al. (2004).

The subspaces, as defined above, are not separated from the bulk cytosol by any physical barrier. Rather, they represent a first approximation to more complex 'local control' models where $[\text{Ca}^{2+}]$ can vary smoothly throughout the cell (Stern, 1992; Rice and Jafri, 2001). Such models may be implemented using partial differential equations for subcellular diffusion of $[\text{Ca}^{2+}]$ (Stern, 1992), but are more commonly simulated using a fine-grained grid of "functional release units", each with their own calcium concentration (Rice et al., 1999; Nivala et al., 2012). Alternative approaches have been used by e.g. Nordin (1993), who define a 'superficial, middle, and deep myoplasm', and Koivumäki et al. (2011), who modelled the myocyte as a series of concentric shells.
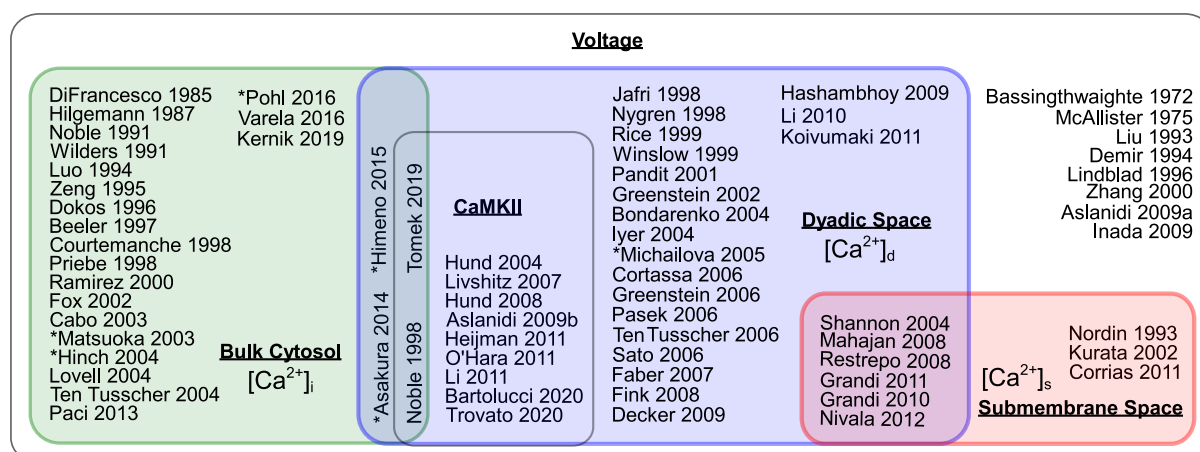
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Voltage

DiFrancesco 1985 Hilgemann 1987 Noble 1991 Wilders 1991 Luo 1994 Zeng 1995 Dokos 1996 Beeler 1997 Courtemanche 1998 Priebe 1998 Ramirez 2000 Fox 2002 Cabo 2003 *Matsuoka 2003 *Hinch 2004 Lovell 2004 Ten Tusscher 2004 Paci 2013	*Pohl 2016 Varela 2016 Kernik 2019 **Bulk Cytosol** [Ca²⁺]ᵢ		

*Himeno 2015 Tomek 2019

CaMKII

Hund 2004
Livshitz 2007
Hund 2008
Aslanidi 2009b
Heijman 2011
O'Hara 2011
Li 2011
Bartolucci 2020
Trovato 2020

*Asakura 2014 Noble 1998

Jafri 1998
Nygren 1998
Rice 1999
Winslow 1999
Pandit 2001
Greenstein 2002
Bondarenko 2004
Iyer 2004
*Michailova 2005
Cortassa 2006
Greenstein 2006
Pasek 2006
Ten Tusscher 2006
Sato 2006
Faber 2007
Fink 2008
Decker 2009

Hashambhoy 2009
Li 2010
Koivumaki 2011

Dyadic Space
[Ca²⁺]_d

Shannon 2004
Mahajan 2008
Restrepo 2008
Grandi 2011
Grandi 2010
Nivala 2012

Bassingthwaighte 1972
McAllister 1975
Liu 1993
Demir 1994
Lindblad 1996
Zhang 2000
Aslanidi 2009a
Inada 2009

Nordin 1993
Kurata 2002
Corrias 2011

[Ca²⁺]_s
Submembrane Space

Figure 4: A venn diagram showing the dependency of I_{CaL} gating and driving force on $[Ca^{2+}]$ and [CaMKII]. All models shown here depend on voltage. I_{CaL} models inside the geen, blue, and red boxes depend on bulk cytosolic calcium, dyadic space calcium, and submembrane space calcium respectively, and models inside the black-edged central box also depend on the concentration of CaMKII. Models marked with an asterisk depend on additional variables, as described in the text.

These different models of cell geometry and $[Ca^{2+}]$ concentrations complicate the task of comparing I_{CaL} models in an AP model. Different assumptions about channel localisation in an AP model will lead to I_{CaL} channels experiencing different intracellular calcium concentrations. I_{CaL} models subsequently have different assumptions about CDI and driving force. Furthermore, since I_{CaL} gating models are often calibrated in the context of an AP model, several more parameters in the I_{CaL} model will be sensitive to the chosen localisation.

In addition to the membrane potential (V_m) and (local) intracellular $[Ca^{2+}]$, I_{CaL} models have been developed that are sensitive to several other variables. The most common of these is the CaMKII concentration, which is assumed to affect CDI in models such as Noble et al. (1998). Effects of ATP concentration on channel gating are accounted for in the models by Matsuoka et al. (2003), Asakura et al. (2014), and Himeno et al. (2015); Michailova et al. (2005) incorporates an effect of [MgATP], and ACh-inhibition of I_{CaL} is modelled by Pohl et al. (2016). Finally, the work by Hinch et al. (2004) uses a single model to describe the L-type calcium channels and ryanodine receptors, leading to a dependency on the state of the SR (interestingly, this model uses the $[Ca^{2+}]_i$ to estimate the concentration in the dyadic space). An overview of the dependencies of each I_{CaL} model is provided in Figure 4.

We next grouped the 71 I_{CaL} models by the calcium concentrations assumed to affect I_{CaL} gating (O) and driving force (D), leading to the twelve categories shown in Table 1. Note that not all models shown in this table fit neatly into the three subspace configurations shown in Figure 3: the studies by Asakura et al. (2014) and Himeno et al. (2015) both define an extra intermediate subspace, between dyadic and bulk cytosolic; while the models by Noble et al. (1998), Mahajan et al. (2008), and Restrepo et al. (2008) use different concentrations for the gating and driving force, which means they cannot be neatly assigned a position in Figure 3.

The naming of spaces varies between studies, and sometimes overlaps or conflicts. In preparing Figure 4 and Table 1, we classified a subspace as 'dyadic' if its primary role was in calcium handling (e.g. if it contained I_{CaL} channels and connected to the SR) while we used the term 'submembrane' space only if several ion species flowed in and out of it, and it covered all or most of the (outer and t-tubular) membrane. An example where this conflicts is Sato et al. (2006), where we classified as 'dyadic' a

subspace termed 'submembrane' by the authors.

No.	Models	O	D
1	Bassingthwaithe and Reuter (1972), McAllister et al. (1975), Liu et al. (1993), Demir et al. (1994), Lindblad et al. (1996), Zhang et al. (2000), Aslanidi et al. (2009a) and Inada et al. (2009)	-	-
2	Beeler and Reuter (1977), Noble et al. (1991), and Wilders et al. (1991)	-	$[Ca^{2+}]_i$
3	Courtemanche et al. (1998), Ramirez et al. (2000), Lovell et al. (2004), and Varela et al. (2016)	$[Ca^{2+}]_i$	-
4	Kurata et al. (2002)	$[Ca^{2+}]_s$	-
5	Jafri et al. (1998), Rice et al. (1999), Nygren et al. (1998), Winslow et al. (1999), Pandit et al. (2001), Bondarenko et al. (2004), Iyer et al. (2004), Michailova et al. (2005), Cortassa et al. (2006), Pásek et al. (2006), and Koivumäki et al. (2011)	$[Ca^{2+}]_d$	-
6	DiFrancesco and Noble (1985), Hilgemann and Noble (1987), Luo and Rudy (1994), Zeng et al. (1995), Dokos et al. (1996), Priebe and Beuckelmann (1998), Fox et al. (2002), Cabo and Boyden (2003), Matsuoka et al. (2003), Ten Tusscher et al. (2004), Paci et al. (2013), Pohl et al. (2016), and Kernik et al. (2019)	$[Ca^{2+}]_i$	$[Ca^{2+}]_i$
7	Nordin (1993), Sato et al. (2006), and Corrias et al. (2011)	$[Ca^{2+}]_s$	$[Ca^{2+}]_s$
8	Hinch et al. (2004), Hund and Rudy (2004), Greenstein and Winslow (2002), Greenstein et al. (2006), Ten Tusscher and Panfilov (2006), Faber et al. (2007), Livshitz and Rudy (2007), Fink et al. (2008), Hund et al. (2008), Aslanidi et al. (2009b), Decker et al. (2009), Hashambhoy et al. (2009), Li et al. (2010), Rovetti et al. (2010), Heijman et al. (2011), O'Hara et al. (2011), Li and Rudy (2011), Nivala et al. (2012), Bartolucci et al. (2020), and Trovato et al. (2020)	$[Ca^{2+}]_d$	$[Ca^{2+}]_d$
9	Tomek et al. (2019), Asakura et al. (2014), and Himeno et al. (2015)	$[Ca^{2+}]_i$ $[Ca^{2+}]_d$	$[Ca^{2+}]_i$ $[Ca^{2+}]_d$
10	Shannon et al. (2004), Grandi et al. (2010), and Grandi et al. (2011)	$[Ca^{2+}]_s$ $[Ca^{2+}]_d$	$[Ca^{2+}]_s$ $[Ca^{2+}]_d$
11	Noble et al. (1998)	$[Ca^{2+}]_d$	$[Ca^{2+}]_i$
12	Mahajan et al. (2008) and Restrepo et al. (2008)	$[Ca^{2+}]_d$	$[Ca^{2+}]_s$

Table 1: I_{CaL} models grouped according to the $[Ca^{2+}]$ they are assumed to depend on in their open probability (O) and driving force (D); extending the illustration in Figure 4.

Gating mechanisms

The feature that varies most between I_{CaL} models is the set of equations used to describe the fraction of open channels, O. This part of the model determines how the current changes over time i.e. it describes the current kinetics or gating. In this section we present a further classification of I_{CaL} models into 15 distinct groups based on their gating equations.

I_{CaL} gating is commonly modelled using either Hodgkin-Huxley models (HHMs) or Markov models (MMs). In HHMs (Hodgkin and Huxley, 1952) the open probability is calculated as the product of several independent 'gates', e.g. one gate representing voltage-dependent activation, one representing VDI, and one representing CDI. The opening and closing of each gate is modelled using a single ordinary differential equation (ODE), although CDI gates are frequently assumed to be very fast and therefore as instantaneously reaching their steady states (e.g. using a Hill equation). In Markov models the channel is postulated to be in one of a finite number of states, and transition rates are defined between the states that can depend on V_m or $[Ca^{2+}]$. In contrast to HHMs, where each process (activation, VDI, CDI) is independent, MMs allow a more general structure where e.g. activation and VDI are coupled (Rudy and Silva, 2006).

In the most common formulation, where the open probability (O) of an HHM is the product of a number of independent gates, an equivalent MM can be written for each HHM (Keener and Sneyd, 1998). However, many I_{CaL} models use an extension to the classical HH scheme, e.g. by introducing a non-inactivating fraction of channels (McAllister et al., 1975), or by modelling the current as if arising from two separate channel families (Nygren et al., 1998) (Table 2). Such models have no obvious MM equivalent. Taking this into account, we identified 15 distinct gating models, as shown schematically in Figure 5. Where possible, we have shown models in an MM representation.

Each gating type is described briefly below. Some models have an O defined in the phosphorylated and non-phosphorylated states because of CAMKII dependence, or have I_{CaL} channels localised in different biological compartments; we do not focus on these properties in this section and are only concerned with the gating kinetics.

Type A is the earliest and most straightforward gating mechanism, consisting of voltage-dependent activation (d) and inactivation (f), modelled as independent gates that are not affected by $[Ca^{2+}]$ (Bassingthwaithe and Reuter, 1972). Wilders et al. (1991) is a unique model within this group because its time constant of inactivation is not voltage-dependent but rather depends on the fraction of inactivation f. **Type B** extends type A by adding a non-inactivating fraction of channels d', leading to an open probability $O = d \cdot f + d'$ (McAllister et al., 1975).

The **type C** gating mechanism extends type A by adding a CDI gate, usually written as f_{Ca}. In **type C1** this is modelled using as an instantaneous process, so that the fraction of open f_{Ca} gates is given by a Hill equation with Hill coefficient 2 in Luo and Rudy (1994) but 1 in the remaining models in this class. **Types C2** and **C3** use an ODE to model the evolution of f_{Ca}, but differ in that C2 models have calcium-independent recovery from inactivation (DiFrancesco and Noble, 1985), while in C3 models both inactivation and recovery depend on $[Ca^{2+}]$ as shown in Figure 5 (C2 and C3). Finally, **type C4** has an instantaneous f_{Ca} gate, but also incorporates calcium-sensitivity in its gate for VDI, making it a dual voltage-calcium-dependent inactivation gate.

Gating **type D** is similar to type C in its HH form, except that the activation gate d is cubed (Nordin, 1993). In the MM structure, this equates to adding several closed states, as shown in Figure 5D.

An ever larger Markov scheme is used by models of **type E1**, in which five steps are required to fully
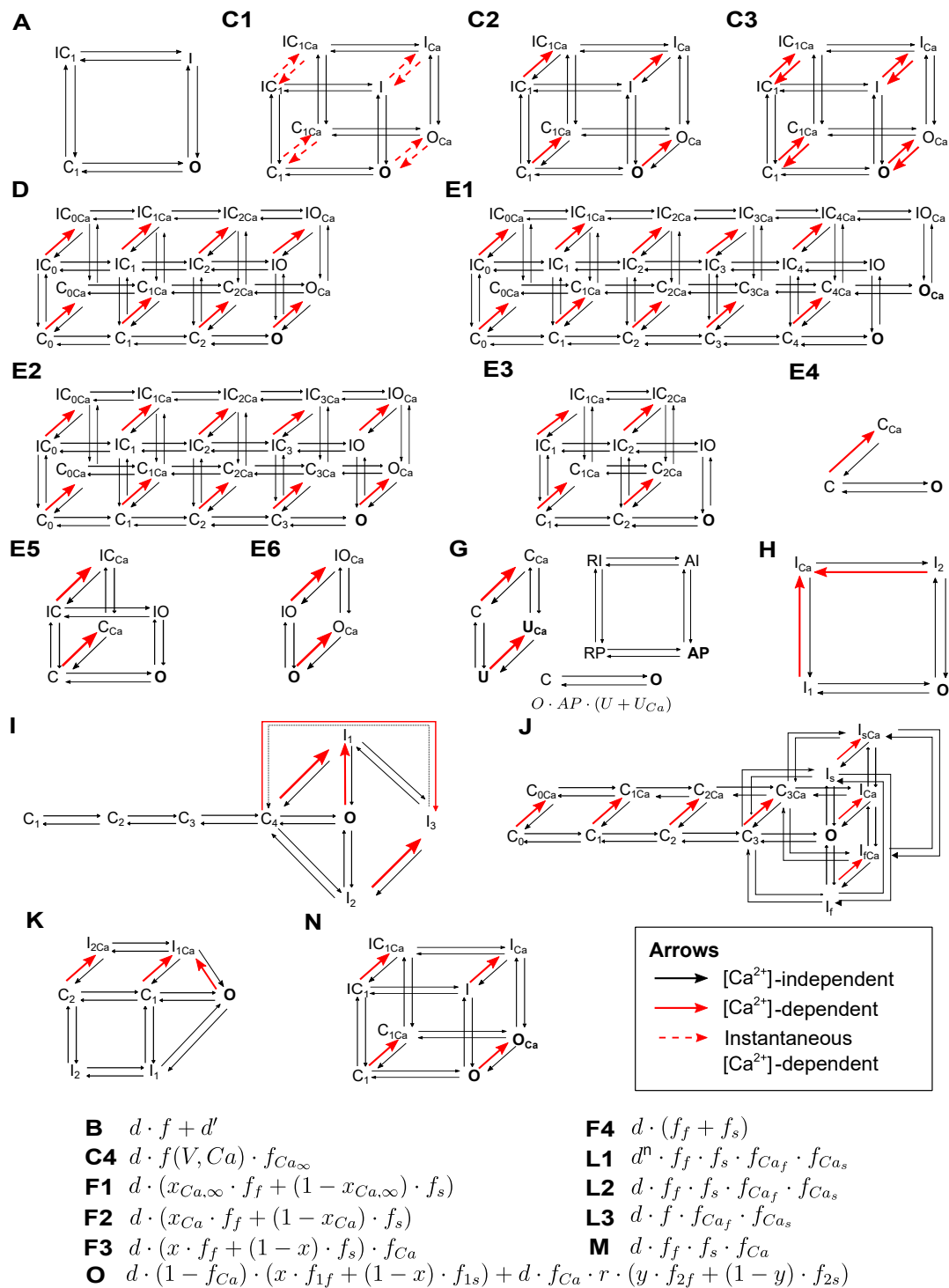
Figure 5: **Models of I_{CaL} gating.** Each label in this figure (A, C1, C2, ...) indicates a distinct gating mechanism, as described in detail in the text. Where possible, models are shown in an MM representation. MM state labels include *C*losed, *I*nactivated, *O*pen, *A*ctivated, *U*ncovered, *R*esting, and *P*rimed. Subscripts s and f are used to indicate states involved in "slow" and "fast" transitions, while the Ca subscripts indicate states involved in calcium-dependent transitions. The conducting states in each Markov structure are shown in bold. Where models have more than one conducting state, the total open fraction is found by adding the occupancy of all conducting states together. The open probability equation for G is shown within the Figure. In the HH equations, d and f denote activation and inactivation gates respectively, and f_{Ca} gates are calcium-dependent.

activate (similar to a fifth power in HH terms). In the original implementation, this model was written as a combination between an HHM (for VDI) and an MM for activation and CDI (Jafri et al., 1998). The mechanism for CDI in this model is a switch to a "Calcium mode" in which transitions to the open state are extremely slow (Imredy and Yue, 1994). A slight variation, which we still classified as E1, is given by Iyer et al. (2004) in which the O_{Ca} and OI_{Ca} states are omitted altogether. Several simplifications of the E1 scheme have been proposed, reducing it from 24 to 20 states (**type E2**, Michailova et al., 2005), 10 states (**type E3**, Greenstein and Winslow, 2002), and even 3 states (**type E4**, Hinch et al., 2004). Note that, to arrive at the representation of the E2 type shown here, we have reinterpreted the model by Michailova et al. (2005) as an MM and omitted the term accounting for [MgATP] effects and a constant factor x. The study by Li et al. (2010) extended the E4 type by re-adding VDI, creating the 6-state **type E5**. Similarly, Asakura et al. (2014) extended E4 with a fourth state to create **type E6**.

Type F gating mechanisms assume that I_{CaL} has fast and slow modes. In **type F1**, the fraction of channels in slow mode is determined by an instantaneous calcium binding process (Nygren et al., 1998), while in **type F2** this process is modelled with an ODE (Pandit et al., 2001). Type F3 separates fast and slow kinetics from calcium by fixing the fraction of channels with fast VDI to 73% and introducing a separate CDI process (Pohl et al., 2016). A similar two-component model without CDI was introduced by Inada et al. (2009), which we have labelled as **type F4**.

The **type G** gating mechanism consists of three independent MMs for activation, VDI, and CDI. In the MM for CDI, the binding of a Ca^{2+} ion brings the system into a state where recovery from inactivation is much slower.

A new **type H** gating mechanism was introduced by Lovell et al. (2004), consisting of a four state MM with activation, VDI and CDI. More complex MMs were introduced by Bondarenko et al. (2004), Faber et al. (2007), and Mahajan et al. (2008) to create **types I**, **J**, and **K** respectively. The unusual scheme in type I was inspired by structure-function relationships in a homology model based on *Shaker B* voltage-gated K^+ models. Type J was the first model to incorporate fast and slow VDI in MM kinetics. Type K used barium as a charge carrier for I_{CaL} to determine the rate constants associated with VDI.

The **type L1** gating mechanism consists of activation, fast and slow VDI, and fast and slow CDI (dependent on both [Ca^{2+}] and I_{CaL}). Unusually, the activation variable is raised to a power n with time-variant behaviour, also modelled as an ODE (Hund and Rudy, 2004). In **type L2** this is simplified to use a constant $n = 1$ (Aslanidi et al., 2009b), and **type L3** simplifies this further by combining fast and slow VDI into a single gate (Hund et al., 2008).

The study by Ten Tusscher and Panfilov (2006) extended their previous C3 type model with an extra gate, leading to **type M**. Note that this can also be seen as a simplification of type L2.

Type N gating uses a similar MM to C2, but with different rates on the transitions, and an increased number of conducting states so that this MM can no longer be reduced to an equivalent HHM. As in type E1, the MM has a 'slow' and a 'fast' side, between which it transitions based on [Ca^{2+}]. Unlike C2, the total probability is given by $O + O_{Ca}$.

Like the F-type mechanisms, **type O** gating splits the channels into several fractions. First, a [Ca^{2+}] dependent variable splits the channels into a fraction with VDI and a fraction with CDI. In turn, each inactivation type is split into a fast and slow fraction, with a fixed ratio between fast and slow VDI and a voltage-dependent ratio between fast and slow CDI.

Table 2 shows how each model fits into this classification. In addition to the gating type, this table also lists each model's cell type, species, and simulated temperature (if stated). The final column provides

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an indication of the major data sources used in the model's construction. For the earlier generation of models, this data source is often hard to establish, as parameters were commonly set by hand to create a model that was acceptably close to a wide range of observations (typically measured in tissue preparations, and sometimes spanning several species). A full list of data sources is available online at https://github.com/CardiacModelling/ical-model-comparison.

Table 2: Models classified by their gating type, with additional information of cell type, species, temperature (T) and the major data sources used in each model's construction. The equivalent MM schematic/equation for each gating class is shown in Figure 5. Minor variants within each class are indicated with (*) and explained in text.

	Models	Cell	Species	T	Major data sources
A	Bassingthwaithe and Reuter (1972)	Ventricle	Mammalian		Beeler and Reuter (1970)
	Beeler and Reuter (1977)	Ventricle	Mammalian		Beeler and Reuter (1970); Reuter (1973, 1974); Gettes and Reuter (1974)
	Noble et al. (1991)	Ventricle	Guinea Pig	37	-
	*Wilders et al. (1991)	SAN	Rabbit	37.5	Nakayama et al. (1984); Hagiwara et al. (1988)
	Liu et al. (1993)	AVN	Rabbit	35	Liu et al. (1993)
B	McAllister et al. (1975)	Purkinje	Mammalian		Reuter (1968); Vitek and Trautwein (1971)
	Demir et al. (1994)	SAN	Rabbit	37	Nilius (1986); Hagiwara et al. (1988); Fermini and Nathan (1991)
	Lindblad et al. (1996)	Atrium	Rabbit	35	Nilius (1986); Hagiwara et al. (1988); Kawano and Hiraoka (1991)
	Zhang et al. (2000)	SAN	Rabbit	37	Nilius (1986); Hagiwara et al. (1988); Fermini and Nathan (1991); Demir et al. (1994)
	Aslanidi et al. (2009a)	Atrium	Rabbit	35	Ko et al. (2006)
C1	*Luo and Rudy (1994)	Ventricle	Guinea Pig	37	-
	Zeng et al. (1995)	Ventricle	Guinea Pig	37	-
	Priebe and Beuckelmann (1998)	Ventricle	Human	37	Beuckelmann et al. (1991, 1992)
	Cabo and Boyden (2003)	Ventricle	Canine	37	Aggarwal and Boyden (1995, 1996)
C2	DiFrancesco and Noble (1985)	Purkinje	Mammalian	37	-
	Dokos et al. (1996)	SAN	Rabbit	37	Nakayama et al. (1984); Hagiwara et al. (1988); Habuchi et al. (1990); Satoh (1994)
	Shannon et al. (2004)	Ventricle	Rabbit	37	-
	Grandi et al. (2010)	Ventricle	Human	37	Pelzmann et al. (1998); Li et al. (1999); Magyar et al. (2002)
	Grandi et al. (2011)	Atrial	Human	37	Li and Nattel (1997); Shannon et al. (2005)
C3	Courtemanche et al. (1998)	Atrium	Human	37	Friedman et al. (1996); Li and Nattel (1997); Sun et al. (1997)
	Noble et al. (1998)	Ventricle	Guinea Pig	37	Linz and Meyer (1997)
	Ramirez et al. (2000)	Atrium	Canine	37	Yue et al. (1997)
	Fox et al. (2002)	Ventricle	Canine	37	-
	Kurata et al. (2002)	SAN	Rabbit	37	Nakayama et al. (1984); Hagiwara et al. (1988); Kawano and Hiraoka (1991); Fermini and Nathan (1991)

Table 2 continued from previous page

	Models	Cell	Species	T	Major data Sources
	Ten Tusscher et al. (2004)	Ventricle	Human	37	Beuckelmann et al. (1991); Bénitah et al. (1992); Mewes and Ravens (1994); Li and Nattel (1997); Sun et al. (1997); Pelzmann et al. (1998); Magyar et al. (2002)
	Sato et al. (2006)	Ventricle	Canine	35	Puglisi et al. (1999)
	Corrias et al. (2011)	Purkinje	Rabbit	37	Kass and Sanguinetti (1984); Hirano et al. (1989)
	Varela et al. (2016)	Atrium	Canine	37	Ehrlich et al. (2003)
	Kernik et al. (2019)		iPSC-CM	37	Ma et al. (2011); Veerman et al. (2016); Li et al. (2017)
C4	Hilgemann and Noble (1987)	Atrium	Rabbit	37	-
D	Nordin (1993)	Ventricle	Guinea Pig	37	Taniguchi et al. (1983); Egan et al. (1989); Nordin et al. (1989)
E1	Jafri et al. (1998)	Ventricle	Guinea Pig	37	McDonald et al. (1986); Hadley and Lederer (1991); Shirokov et al. (1993); Imredy and Yue (1994)
	Rice et al. (1999)	Ventricle	Guinea Pig	37	-
	Winslow et al. (1999)	Ventricle	Canine	37	Tseng et al. (1987); Kääb et al. (1996)
	Greenstein and Winslow (2002)	Ventricle	Canine	37	Tseng et al. (1987); Rose et al. (1992); Kääb et al. (1996)
	*Iyer et al. (2004)	Ventricle	Human	37	Li et al. (1999); Magyar et al. (2002)
	Cortassa et al. (2006)	Ventricle	Rat	37	-
	Hashambhoy et al. (2009)	Ventricle	Canine	37	
E2	Michailova et al. (2005)	Ventricle	Canine	37	-
E3	Greenstein et al. (2006)	Ventricle	Canine	37	-
E4	Hinch et al. (2004)	Ventricle	Rat	25	Zahradníková et al. (2004)
E5	Li et al. (2010)	Ventricle	Mouse	35	Li et al. (2010)
E6	Asakura et al. (2014)	Ventricle	Human	37	Beuckelmann et al. (1991); Mewes and Ravens (1994); Pelzmann et al. (1998); Li et al. (1999); Magyar et al. (2002)
	Himeno et al. (2015)	Ventricle	Human	37	Mewes and Ravens (1994); Pelzmann et al. (1998); Magyar et al. (2002)
F1	Nygren et al. (1998)	Atrium	Human	33	Escande et al. (1986); Le Grand et al. (1991); Bénitah et al. (1992); Le Grand et al. (1994); Mewes and Ravens (1994); Li and Nattel (1997)
F2	Pandit et al. (2001)	Ventricle	Rat	22	Sun et al. (2000)
	Pásek et al. (2006)	Ventricle	Rat	22	Katsube et al. (1998)
F3	Pohl et al. (2016)	SAN	Human	37	Li and Nattel (1997)
F4	Inada et al. (2009)	AVN	Rabbit	37	-

Table 2 continued from previous page

	Models	Cell	Species	T	Major data Sources
G	Matsuoka et al. (2003)	Ventricle	Guinea Pig	37	Noma and Shibasaki (1985); Hagiwara et al. (1988); Boyett et al. (1994); Takagi et al. (1998)
H	Lovell et al. (2004)	SAN	Rabbit	37	Kodama et al. (1999)
I	Bondarenko et al. (2004)	Ventricle	Mouse	25	Bondarenko et al. (2004)
J	Faber et al. (2007)	Ventricle	Guinea Pig	37	Cavalié et al. (1986); Rose et al. (1992); Höfer et al. (1997); Vornanen and Shepherd (1997); Findlay (2002, 2004)
K	Mahajan et al. (2008)	Ventricle	Rabbit	35	Mahajan et al. (2008)
	Restrepo et al. (2008)	Ventricle	Rabbit	35	-
	Nivala et al. (2012)	Ventricle	Rabbit	37	-
L1	Hund and Rudy (2004)	Ventricle	Canine	37	Sun et al. (1997); Rubart et al. (2000); Kamp et al. (2000); Miyoshi et al. (2003)
	Livshitz and Rudy (2007)	Ventricle	Canine	37	-
L2	Aslanidi et al. (2009b)	Purkinje	Canine	35	Han et al. (2001)
	Li and Rudy (2011)	Purkinje	Canine	37	Han et al. (2001)
L3	Hund et al. (2008)	Ventricle	Canine	37	-
M	Ten Tusscher and Panfilov (2006)	Ventricle	Human	37	Magyar et al. (2002)
	Fink et al. (2008)	Ventricle	Human	37	-
	Koivumäki et al. (2011)	Atrium	Human	33	Li and Nattel (1997)
	Paci et al. (2013)	Atrium	iPSC-CM	37	Ma et al. (2011)
N	Decker et al. (2009)	Ventricle	Canine	37	Tseng (1988); Aggarwal and Boyden (1995); Rubart et al. (2000); Szabó et al. (2005)
	Heijman et al. (2011)	Ventricle	Canine	37	-
	Bartolucci et al. (2020)	Ventricle	Human	37	Magyar et al. (2002); Fülöp et al. (2004); O'Hara et al. (2011)
O	O'Hara et al. (2011)	Ventricle	Human	37	Magyar et al. (2002); Fülöp et al. (2004); O'Hara et al. (2011)
	Tomek et al. (2019)	Ventricle	Human	37	Magyar et al. (2002)
	Trovato et al. (2020)	Purkinje	Human	37	-

Driving force

Two types of driving force are common in I_{CaL} models. An Ohmic driving force for a current carried by a single species takes the form

$$D_{Ohmic} = (V_m - E_{rev}), \tag{2}$$

where E_{rev} is the *reversal potential*, at which the current reverses direction. For currents carried by a single species, the reversal potential can be calculated using the Nernst equation

$$E_{rev} = \frac{RT}{z_X F} \ln \frac{[X]_o}{[X]_i}, \tag{3}$$

where R is the universal gas constant, T is temperature, F is the Faraday constant, z_x is the valence of a single ion of species X (2 for $[Ca^{2+}]$), and $[X]_o$ and $[X]_i$ are the external and internal concentrations of X respectively. Although commonly used in the form given above, a more accurate version uses $\gamma_o[X]_o/\gamma_i[X]_i$, where γ_o and γ_i are dimensionless *activity coefficients* that account for non-ideal behaviour of the solutes. The units of the gas constant are frequently chosen as mJ/K/mol to yield a reversal potential in mV. A model with an Ohmic driving term is written $I = \bar{g} \cdot O \cdot (V - E_{rev})$, where $\bar{g}$ is in Siemens (S) for a current in Amperes (A).

A more complex model of the electrochemical driving force is given by the Goldman-Hodgkin-Katz (GHK) flux equation (Goldman, 1943; Hodgkin and Katz, 1949):

$$D_{GHK} = V_m \frac{z_X^2 F^2}{RT} \left(\frac{\gamma_i[X]_i - \gamma_o[X]_o e^{-z_X V_m F/(RT)}}{1 - e^{-z_X V_m F/(RT)}} \right). \tag{4}$$

Because its derivation involves assuming a constant electrical field throughout the channel, the GHK equation and its derivatives are also known as "constant field theory". Assuming concentrations in mM = mol/m³ and using matching units for V and RT/F, a model with a GHK driving term is written as $I = \bar{P} \cdot O \cdot D_{GHK}$, where $\bar{P}$ is in L/ms (= m³/s) for a current in A, in L/F/ms for a current in A/F, or in cm/s for a current in μA/cm².

A number of early studies used a modified GHK equation, which accounts for the (hypothesised) presence of a charged particle near the channel mouth, causing a change V_0 in the voltage across the channel (Frankenhaeuser, 1960):

$$D_{GHK'} = (V_m - V_0) \frac{z_X^2 F^2}{RT} \left(\frac{\gamma_i[X]_i e^{V_0 \frac{z_X F}{RT}} - \gamma_o[X]_o e^{(V_m - V_0) \frac{-z_X F}{RT}}}{1 - e^{(V_m - V_0) \frac{-z_X F}{RT}}} \right). \tag{5}$$

The equations for D_{Ohmic}, D_{GHK}, and $D_{GHK'}$ all predict that the current carried by a single species X reverses at $V_m = E_{rev}$. For I_{CaL}, which is known to have calcium, potassium, and sodium components (Reuter and Scholz, 1977), the situation is more complex, and applying the Nernst equation for calcium as the only carrier leads to estimates for E_{rev} in the range 100–200 mV, which is significantly higher than experimental estimates of 40–70 mV. A simple model for currents with multiple carriers can be made by assuming that each species travels through the channel without affecting the others, so that the total current is simply a sum of single-species currents. With this assumption, equations for E_{rev} can still be derived (see e.g. Campbell et al., 1988; Keener and Sneyd, 1998) but the predicted reversal potentials from Ohmic and GHK models are no longer the same. And crucially, the reversal potential of a multi-species current depends strongly on the ratio between the species' permeabilities $\bar{P}_X$ (or conductances $\bar{g}_X$, if an Ohmic term is used). A study by Campbell et al. (1988) measured the reversal potential of I_{CaL} in bull-frog atrial myocytes, and compared this to predictions using different ratios of $\bar{P}_K : \bar{P}_{Ca}$. They found that good agreement with experiment could be found using a GHK equation (Equation 4), provided the channel was highly selective to $[Ca^{2+}]$ (>95% of the I_{CaL} is carried by $[Ca^{2+}]$ at 0 mV). Similar

estimates could be made using the modified GHK (Equation 5), regardless of the chosen value of V_0, leading e.g. Luo and Rudy (1994) to set $V_0 = 0$. A later study by Zhou and Bers (2000) used fluorescence microscopy to simultaneously measure $[Ca^{2+}]$ influx and I_{CaL} (all ionic current) independently. Stepping to potentials beyond the I_{CaL} reversal potential, they found continued $[Ca^{2+}]$ influx, which continued until the predicted $[Ca^{2+}]$ reversal potential was reached. This is consistent with the hypothesis that, at its reversal potential, I_{CaL} is in a balanced equilibrium between opposing flows carried by different species.
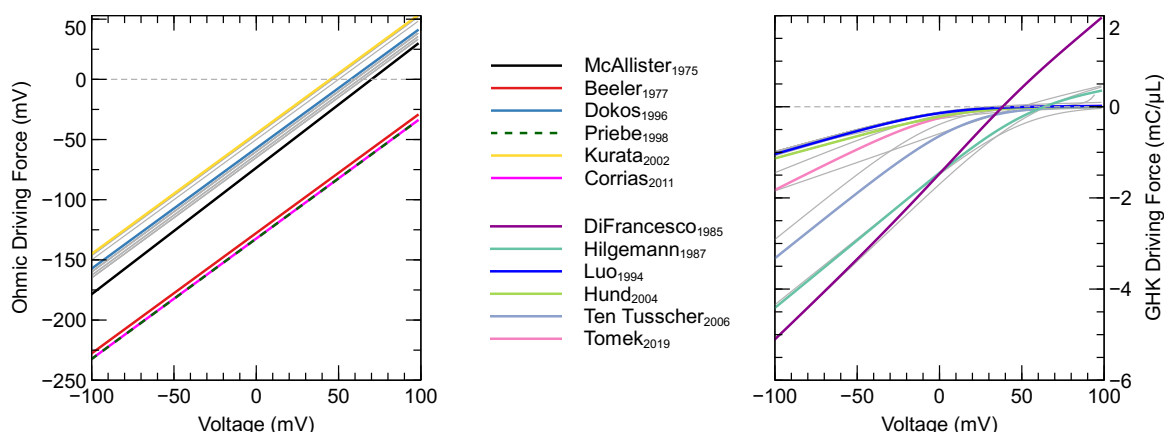
Figure 6: Driving term as a function of voltage for models with an Ohmic driving term (**Left**) and a (normal or modified) GHK driving term (**Right**). In the left panel, the majority of models are plotted in grey and are shown to form a tight cluster, reversing at around 65 mV. The lower and upper bounds for this cluster are marked by McAllister et al. (1975) and Kurata et al. (2002), which are indicated in colour, along with three outliers (Beeler and Reuter, 1977; Priebe and Beuckelmann, 1998; Corrias et al., 2011) that do not show a reversal potential within the physiological range. In the right panel, most currents are again shown in grey, but a selection of models are shown in colour to show the range of behaviours observable by varying the activity coefficients and voltage offset V_0 (DiFrancesco and Noble, 1985; Hilgemann and Noble, 1987; Luo and Rudy, 1994; Hund and Rudy, 2004; Ten Tusscher and Panfilov, 2006; Tomek et al., 2019). A full description of how this figure was constructed is given in the main text.

Assuming fixed internal and external concentrations, the driving term can be plotted as a function of voltage, as shown in Figure 6. To create this plot, we assumed values of $[Na^+]_o = 140$ mM, $[Na^+]_i = 10$ mM, $[K^+]_o = 5$ mM, $[K^+]_i = 140$ mM, $[Cl^-]_o = 150$ mM, $[Cl^-]_i = 24$ mM, $[Ca^{2+}]_o = 2$ mM and $[Ca^{2+}]_s = [Ca^{2+}]_i = [Ca^{2+}]_d = 10^{-4}$ mM. In models where I_{CaL} is carried by multiple species, we calculated the "net driving term" by summing up the contributions of each component, and weighting by the component's permeability relative to the calcium component (e.g. the calcium component has weight $\bar{P}_{Ca}/\bar{P}_{Ca} = 1$, the potassium component has weight $\bar{P}_K/\bar{P}_{Ca}$, etc.).

The left panel of Figure 6 shows D for the models in this study that used an Ohmic driving term (models for which we could not find the full equations are omitted). Rather than use the Nernst equation, most of these models set a constant reversal potential in the range of 45–70 mV. As expected, models that do use the single-species Nernst equation (Beeler and Reuter, 1970; Dokos et al., 1996; Priebe and Beuckelmann, 1998; Kurata et al., 2002) show a reversal potential well outside of the physiological range. The right panel in Figure 6 shows D for models with a GHK (or GHK') driving term. Most of these models do not show a true 'reversal' of current, with the driving force approaching zero for high voltages. Only models with a high permeability for sodium and potassium ions (DiFrancesco and Noble, 1985; Hilgemann and Noble, 1987) show a positive driving force for high voltages. Finally, the model by Liu et al. (1993) uses

neither an Ohmic nor a GHK driving term, but an exponentially increasing flux and is not included in this figure.

A list of models with Ohmic driving terms is given in Table 3. For models using a fixed E_{rev}, the numerical value is shown, while the equation used for E_{rev} is shown for the remainder. None of the models with Ohmic driving terms in this study explicitly modelled potassium or sodium components of I_{CaL} (although their existence is implicitly acknowledged in the models with a fixed reversal potential).

A similar list for models with GHK (and GHK') driving is given in Table 4, along with the offset V_0 (if used), the activity coefficients for internal and external calcium, and the ratio between the permeability coefficients of potassium and sodium with respect to calcium.

The earliest studies in this table all use a voltage shift parameter $V_0 = 50$ mV, but this form is rarely seen in later models. Models with this large V_0 also assume a large contribution of sodium and potassium ions, consistent with the analysis by Campbell et al. (1988).

The model by Luo and Rudy (1994) abandons the use of V_0 and introduces the values $\gamma_i = 1$ and $\gamma_o = 0.341$ for the activity coefficients of internal and external calcium. These values can be calculated using the Pitzer equations (Pitzer and Mayorga, 1973), while the frequently used value $\gamma_i = 1$ appears to arise from assuming that low internal $[\text{Ca}^{2+}]$ leads to near-ideal behaviour. Instead of using constant values, the model by Tomek et al. (2019) calculates the activity coefficients using the Davies equation (Davies and Malpass, 1964), which is a precursor to Pitzer's work. Activity coefficients for sodium and potassium are usually taken to be 0.75 internally and externally, and are not shown in the table.

Although there is a common consensus that I_{CaL} is carried by multiple ion species, the ratio of permeabilities between the different species varies greatly between models, and several studies have cited the low permeability to potassium and sodium as a reason to omit these components from the model altogether. In general, older models assume larger contributions from sodium and potassium, while more recent models assume a much more selective channel. Instead of fixed permeability ratios, a small number of models calculate the permeability to potassium as a function of the calcium driving force (Jafri et al., 1998; Winslow et al., 1999; Fox et al., 2002; Iyer et al., 2004; Cortassa et al., 2006). This is indicated with $f(V, Ca)$ in the table.

Finally, some of the models in Table 4 use a slight variation of the (normal or modified) GHK equation. The model by Jafri et al. (1998) and many of its descendants, (Rice et al., 1999; Winslow et al., 1999; Iyer et al., 2004; Michailova et al., 2005; Cortassa et al., 2006) use a constant internal calcium activity $\gamma_i[\text{Ca}^{2+}]_i = 0.001$ mM (Smith, 1996). The model by Ten Tusscher and Panfilov (2006) uses a GHK equation in which V is offset by 15 mV, but without the extra term $\left(\exp\left(V_o \frac{z_X F}{RT}\right)\right)$ used in Equation 5.

Models	E_{rev} (mV)
Bassingthwaithe and Reuter (1972)	42 mV
McAllister et al. (1975)	70 mV
Beeler and Reuter (1977)	$-82.3 - 13.0287 \ln \dfrac{[\mathrm{Ca}^{2+}]_i}{1000 \, \mathrm{mM}}$
Demir et al. (1994)	46.4 mV
Lindblad et al. (1996)	60 mV
Dokos et al. (1996)	$-75 \, \mathrm{mV} + \dfrac{RT}{2F} \ln \dfrac{[\mathrm{Ca}^{2+}]_o}{[\mathrm{Ca}^{2+}]_i}$
Courtemanche et al. (1998)	65 mV
Nygren et al. (1998)	60 mV
Priebe and Beuckelmann (1998)	$\dfrac{RT}{2F} \ln \dfrac{[\mathrm{Ca}^{2+}]_o}{[\mathrm{Ca}^{2+}]_i}$
Ramirez et al. (2000)	65 mV
Zhang et al. (2000)	46.4 mV
Pandit et al. (2001)	65 mV
Kurata et al. (2002)	45 mV
Bondarenko et al. (2004)	63 mV
Lovell et al. (2004)	49.72 mV
Aslanidi et al. (2009a)	50 mV
Inada et al. (2009)	62.5 mV
Corrias et al. (2011)	$\dfrac{RT}{2F} \ln \dfrac{[\mathrm{Ca}^{2+}]_o}{[\mathrm{Ca}^{2+}]_i}$
Koivumäki et al. (2011)	60 mV
Pohl et al. (2016)	$-75 \, \mathrm{mV} + \dfrac{RT}{2F} \ln \dfrac{[\mathrm{Ca}^{2+}]_o}{[\mathrm{Ca}^{2+}]_i}$
Varela et al. (2016)	60 mV

Table 3: Reversal potentials for models using an Ohmic driving force (Equation 2).

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Models	$\mathbf{V_o}$	γ_i	γ_o	$\bar{P}_{\mathrm{K}} : \bar{P}_{\mathrm{Ca}}$	$\bar{P}_{\mathrm{Na}} : \bar{P}_{\mathrm{Ca}}$
DiFrancesco and Noble (1985)	50	1	1	1:100	1:100
Hilgemann and Noble (1987)	50	1	1	1:500	1:100
Noble et al. (1991)	50	1	1	1:500	1:100
Wilders et al. (1991)	50	1	1	1:100	1:100
Nordin (1993)	50.1	1	1	1:197.3	-
Luo and Rudy (1994)	0	1	0.341	1:2798	1:800
Zeng et al. (1995)	0	1	0.341	1:2798	1:800
*Jafri et al. (1998)	0	1	0.341	$f(V, Ca)$	-
Noble et al. (1998)	50	1	1	1:500	1:500
*Rice et al. (1999)	0	1	0.341	-	-
*Winslow et al. (1999)	0	1	0.341	$f(V, Ca)$	-
Fox et al. (2002)	0	1	0.341	$f(V, Ca)$	-
Greenstein and Winslow (2002)	0	1	0.341	-	-
Cabo and Boyden (2003)	0	1	0.341	1:1554	1:444
Matsuoka et al. (2003)	0	1	1	1:2730	1:54054
Hinch et al. (2004)	0	1	1	-	-
Hund and Rudy (2004)	15	1	0.341	-	-
*Iyer et al. (2004)	0	1	0.341	$f(V, Ca)$	-
Shannon et al. (2004)	0	0.341	0.341	1:2000	1:36000
Ten Tusscher et al. (2004)	0	1	0.341	-	-
*Michailova et al. (2005)	0	1	0.341	1:540	-
*Cortassa et al. (2006)	0	1	1	$f(V, Ca)$	-
Greenstein et al. (2006)	0	1	0.341	-	-
Sato et al. (2006)	0	1	0.341	-	-
Pásek et al. (2006)	0	1	0.341	-	-
*Ten Tusscher and Panfilov (2006)	15	0.25	1	-	-
Faber et al. (2007)	0	0.01	0.341	1:2780	1:800
Livshitz and Rudy (2007)	15	0.341	0.341	-	-
*Fink et al. (2008)	15	0.25	1	-	-
Hund et al. (2008)	0	1	0.341	-	-
Mahajan et al. (2008)	0	1	0.341	-	-
Restrepo et al. (2008)	0	0.341	0.341	-	-
Aslanidi et al. (2009b)	15	1	0.341	-	-
Decker et al. (2009)	0	1	0.341	-	-
Hashambhoy et al. (2009)	0	1	0.341	-	-
Grandi et al. (2010)	0	0.341	0.341	1:2022	1:36000
Li et al. (2010)	0	1	1	-	-
Grandi et al. (2011)	0	0.341	0.341	1:2000	1:36000
Heijman et al. (2011)	0	1	0.341	-	-
Li and Rudy (2011)	15	1	0.341	-	-
O'Hara et al. (2011)	0	1	0.341	1:2798	1:800
Nivala et al. (2012)	0	1	0.341	-	-
Paci et al. (2013)	0	1	0.341	-	-
Asakura et al. (2014)	0	1	1	1:682	1:54054
Himeno et al. (2015)	0	1	1	1:2730	1:54054
Kernik et al. (2019)	0	0.341	0.341	1:2000	1:36000
Tomek et al. (2019)	0	f	f	1:2798	1:800
Bartolucci et al. (2020)	0	1.2	0.341	1:2801	1:800
Trovato et al. (2020)	0	1	0.341	1:2798	1:800

Table 4: GHK and GHK' parameters in models using GHK driving terms (Equation 5). Models marked with a (*) use variations of the GHK equation, as discussed in the main text.

Part 2. Quantitative comparison

In this section, 60 models are compared *functionally* (Cooper et al., 2011) by studying their predicted I_{CaL} responses to voltage-clamp protocols. Voltage-step experiments are simulated to compare activation, inactivation, and recovery from inactivation under a wide range of voltages and AP- and AP-CaT clamp are performed to show the predicted I_{CaL} during an AP.

Methods

Model implementation

Where possible, models in CellML 1.0 or 1.1 format (Hedley et al., 2001) were obtained from the Physiome Model Repository (PMR) (Yu et al., 2011). Thirty-five (35) models obtained in this way could be used directly, while a further thirteen needed corrections to either units or equations. Five (5) of these corrected models were reduced to I_{CaL}-only models, and 7 were updated on PMR. For eleven (11) models no CellML files were available so new implementations were created based on published equations or code. A full model implementation was created for Heijman et al. (2011), while we made CellML models containing only I_{CaL} for Wilders et al. (1991); Liu et al. (1993); Nordin (1993); Cabo and Boyden (2003); Cortassa et al. (2006); Sato et al. (2006); Faber et al. (2007); Hund et al. (2008); Li and Rudy (2011); Kernik et al. (2019). In the AP model by Pásek et al. (2006) (which we obtained from the PMR), the voltage across the T-tubular membrane can differ from the 'main' transmembrane potential. To compare the channel kinetics consistently, we set this secondary voltage to equal the transmembrane potential V_m.

Simulation software

Simulations were run using the Cardiac Electrophysiology Web Lab (Cooper et al., 2016; Daly et al., 2018). This is a resource developed to allow the characterisation and comparison of cardiac electrophysiology models in a wide range of experimental scenarios. It uses a novel protocol language that allows the user to separate the details of the mathematical model of the channel from the experimental protocol being simulated. We also performed simulations for calcium sensitivity (see "Calcium-dependent inactivation") by solving the model equations using CVODE version 3.1.2 as incorporated in Myokit (Clerx et al., 2016) version 1.28.4, using Python version 3.7.3.

Model annotations

To run simulations in the Web Lab, models are encoded in CellML format and annotated with metadata terms. These terms allow variables with the same physiological meaning to be identified in different models. This is a useful feature for this study as it allows the comparison of our 60 models — which do not use consistent naming for the same variables.

The following variables were annotated in all models: membrane potential (V_m), the time for which the simulation is run, the total I_{CaL}, driving term (D), and the open probability (O). For models in which I_{CaL} is split into multiple components (by ionic species, phosphorylated/non-phosphorylated fraction, or biological subcompartment) we selected the variable that represents the sum over all these aspects to annotate as I_{CaL}. For this purpose, a new variable was often introduced in the CellML files. Similarly, O is sometimes split into components with or without phosphorylation, D can be split by ionic species, and both O and D are occasionally split by the biological compartment. For all such cases, we introduced and annotated O and D as the weighted average over all these components (see e.g. the annotations in our file for Bartolucci et al., 2020). This weighting was made based on the fraction of phosphorylated

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channels, the relative permeability of each ionic species with respect to calcium, and/or the fraction of channels in each biological compartment. When annotating driving term variables, distinct terms were used for Ohmic and GHK formulations.

Finally, we annotated the variables representing ionic concentrations. Intra- and extracellular concentration variables were annotated for Ca^{2+}, Na^+, K^+, and Cl^-. For external concentrations, most models use a single constant-parameter but some make a distinction between a constant "bath concentration" and a time-varying "cleft concentration" near the cell. All three types of external concentration variable were annotated (and later fixed). Similarly, we annotated (and later fixed) intracellular concentrations for each ionic species with labels for bulk cytosol, submembrane space, or dyadic space concentration. Concentrations within subcompartments such as the sarcoplasmic reticulum were not annotated because they don't contribute to the total I_{CaL}.

Ionic concentrations

In all simulations in this study, extracellular concentrations were set to $[Na^+] = 140\,mM$, $[K^+] = 5\,mM$, $[Cl^-] = 150\,mM$, and $[Ca^{2+}] = 2\,mM$, and kept constant at those values. Similarly, intracellular concentrations were fixed to $[Na^+] = 10\,mM$, $[K^+] = 140\,mM$, and $[Cl^-] = 24\,mM$. This corresponds to a patch-clamp setting where these concentrations are well buffered by the bath and pipette solutions. Except where stated otherwise, the internal calcium concentrations for $[Ca^{2+}]$ were fixed to $10^{-9}\,mM$. These fixed concentrations allow the current kinetics to be compared in the absence of channel localisation effects; we will revisit the impact of this choice later. Where present, phosphorylation levels were allowed to vary as dictated by the model equations (the level of phosphorylation, however, depends on the internal calcium concentration, which was set to a fixed level in each simulation).

Data availability

All model and simulation files are available under an open source BSD 3 Clause license, and can be obtained from https://github.com/CardiacModelling/ical-model-comparison.
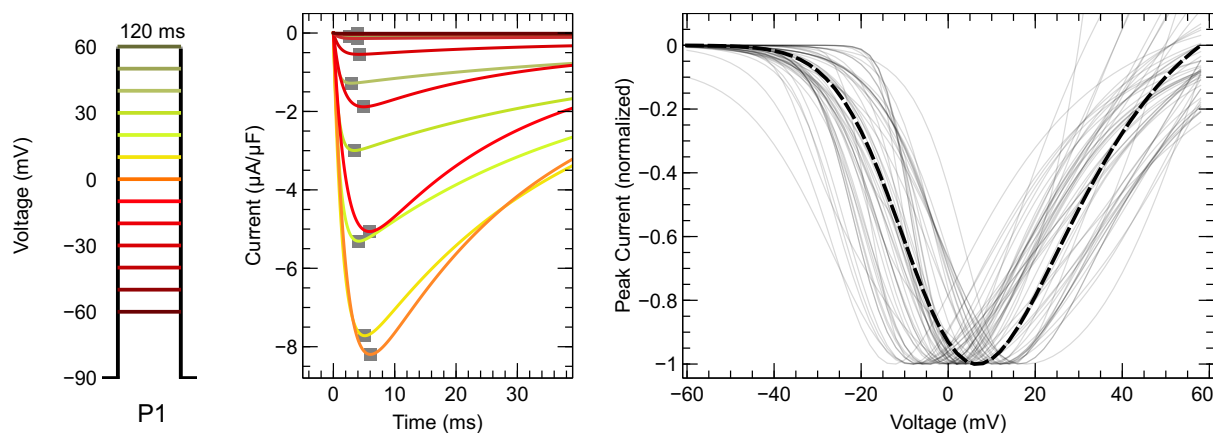
Activation

Figure 7: **Left**: Voltage-clamp protocol used to characterise activation (see main text for details). **Centre**: Simulated I_{CaL} response using the model by Grandi et al. (2010). Traces from successive sweeps are overlaid and colour-coded to match the P1 steps in the first panel. The peak I_{CaL} at each voltage step is marked with a grey square: these values are used to construct the I-V curves on the right. This process of constructing an I-V curve is shown in the animation online at https://github.com/CardiacModelling/ical-model-comparison. **Right**: Normalised peak I_{CaL} versus step voltage for 55 (out of 60) models (the direction of the current was preserved during normalisation). The black dashed line shows the I-V curve from Faber et al. (2007), which is close to the median response. The models by McAllister et al. (1975), Beeler and Reuter (1970), Liu et al. (1993), Dokos et al. (1996), and Corrias et al. (2011) showed outlier responses, and are plotted separately in Figure 8. The simulation results for all of the models can be compared on the Cardiac Electrophysiology Web Lab at https://bit.ly/LtypeCa.

An activation protocol was adapted from O'Hara et al. (2011). It consists of repeating units called *sweeps*. Each sweep starts with stepping up the membrane voltage from a 20 s-long *holding potential* at -90 mV to a 120 ms step at the *test potential*, denoted by P1 in Figure 7 (left). The test potential at P1 is -60 mV for the first sweep and increases by 2 mV per sweep (a subset of which is shown in the figure), up to 60 mV in the final sweep.

Current was recorded during P1 to measure the peak I_{CaL} (I) at each sweep (Figure 7, centre) which was normalised as $\bar{I} = I/|\min I|$. The normalised peak I_{CaL} ($\bar{I}$) was plotted against the test potential to construct an I-V curve.

This process was applied to all models, leading to the normalised I-V curves shown in Figure 7 (right). The I-V curve is useful to establish the activation kinetics for ion channels. Here we see that most I_{CaL} models predict that channels begin to activate at membrane voltages around -40 mV and that I_{CaL} reaches its maximum magnitude between -20 to 20 mV. We next calculated the voltage at which half of the maximum peak is simulated ($V_{0.5}$) for each model, by finding the point where the I-V curve first crosses -0.5. The $V_{0.5}$ varies between -48 to 1.1 mV for the models in this study while the median $V_{0.5}$ is -13.7 mV. By comparison, examples from the experimental (patch-clamp) literature show that I_{CaL} channels start to activate at around -30 mV, that peak I_{CaL} is observed at 0 mV, and $V_{0.5}$ lies between -20 to 0 mV (Rose et al., 1992; Magyar et al., 2000; Liao et al., 2007).
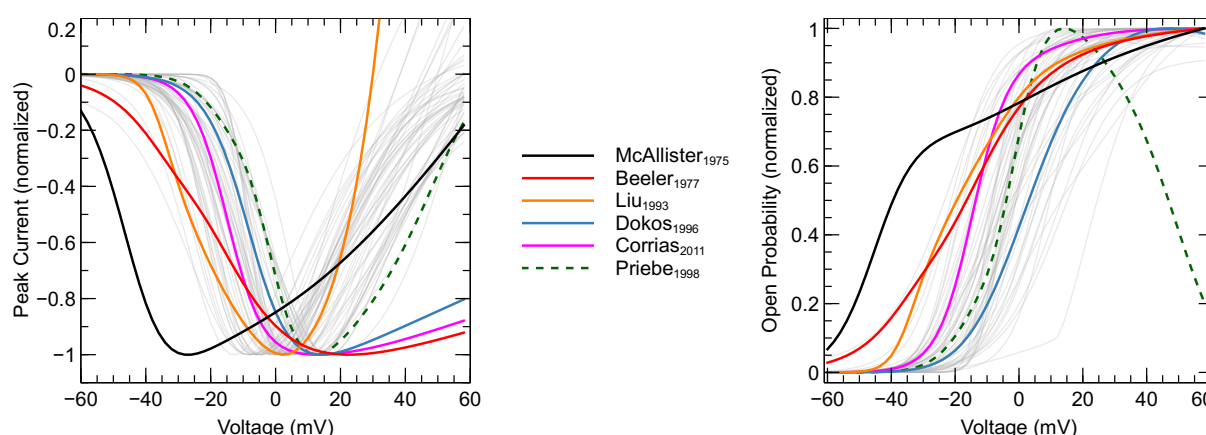
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Figure 8: **Left**: I-V curve and **Right**: Normalised peak-open probability plotted against test potential for all 60 models. The 5 outlier models are labelled here along with the model by Priebe and Beuckelmann (1998); all 6 of these models are discussed in the main text while the rest are shown in grey. The simulation results for all of the models can be compared on the Cardiac Electrophysiology Web Lab at `https://bit.ly/LtypeCa`.

We now take a closer look at the outlier models not included in Figure 7. Figure 8 (left) shows the I-V curve for all 60 models, including the outliers. To investigate the possible reasons for the outlier behaviour, we dissected simulated I_{CaL} into open probability (O) and driving term (D). Normalised peak-O ($\bar{O}$) is plotted against the test potential (O-V curve) in Figure 8 (right), where normalisation was performed using $\bar{O} = O/|\max O|$.

Of the 5 outlier models, only the McAllister et al. (1975) model has an unusual O-V curve, because of which the peak I_{CaL} is reached at a lower voltage than other models. The model by Liu et al. (1993) has an exponentially increasing driving term leading to the unusual I-V curve. The models by Beeler and Reuter (1977), Dokos et al. (1996), and Corrias et al. (2011) continue to exhibit large current at higher voltages. For Beeler and Reuter (1970) and Corrias et al. (2011), this observation can be explained by the driving terms which do not approach a reversal potential within the physiological range of the membrane voltage (Figure 6, Table 3). The model by Priebe and Beuckelmann (1998) has a similar driving term, but this is compensated by an outlier O-V curve leading to a typical I-V curve.

From this dissection of I_{CaL} into O and D we learn that sometimes irregularities in modelling of one aspect (e.g. O) have been compensated by irregularities in other aspects (e.g. D).
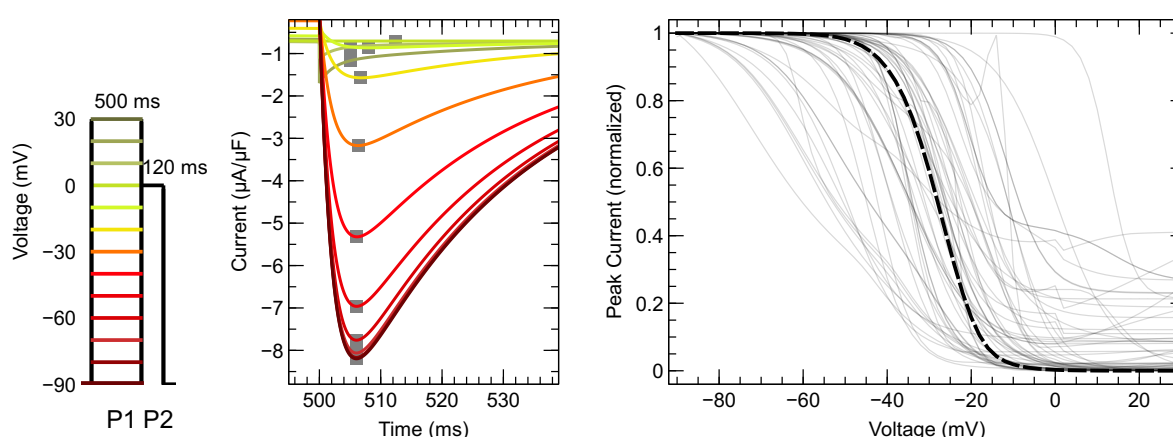
Voltage-dependent inactivation

Figure 9: **Left**: Voltage-clamp protocol used to characterise inactivation (see main text for details). **Centre**: I_{CaL} response during P2 as predicted by the Grandi et al. (2010) model. Traces from successive sweeps are overlaid and colour-coded to match the P1 steps in the left panel. The peak I_{CaL} at each voltage step (marked with grey squares) is used to construct the I-V curves on the right. This process of constructing an I-V curve is shown in the animation online at https://github.com/CardiacModelling/ical-model-comparison. **Right**: Normalised peak I_{CaL} versus step voltage curve for 60 models. The I-V curve from Kurata et al. (2002), which is close to the median response over all models, is highlighted with a black dashed line. The simulation results for all of the models can be compared on the Cardiac Electrophysiology Web Lab at `https://bit.ly/LtypeCa`.

A protocol to characterise voltage-dependent inactivation (VDI) was adapted from Magyar et al. (2000) and is shown in Figure 9 (left). Each sweep in this protocol starts with 20 s at a holding potential of -90 mV, followed by a 500 ms step (P1) to a variable *conditioning potential* and a 120 ms step (P2) to a fixed *test potential* of 0 mV. The conditioning potential at P1 is -90 mV for the first sweep and increases by 2 mV per sweep up to 30 mV for the final sweep (a subset of which is shown in the figure).

Current was recorded during P2 to measure peak I_{CaL} (I) (Figure 9, centre) which was normalised as $\bar{I} = I/\min I$. Normalised peak I_{CaL} ($\bar{I}$) was plotted against conditioning potential to construct the I-V curves shown in Figure 9 (right).

This figure shows that most models predict inactivation to set in at around -60 mV or greater. The conditioning potential after which the peak I_{CaL} is halved ($V_{0.5}$) was identified as the first voltage at which the I-V curve crosses 0.5. The $V_{0.5}$ varies between -31 to 10 mV for the models in this study while the median $V_{0.5}$ is -29.8 mV. By comparison, examples from ventricular cells at physiological temperature show that I_{CaL} channels begin to inactivate after a conditioning voltage of around -60 mV and that $V_{0.5}$ lies between -30 and -24 mV (Li et al., 1999; Kim et al., 2016).

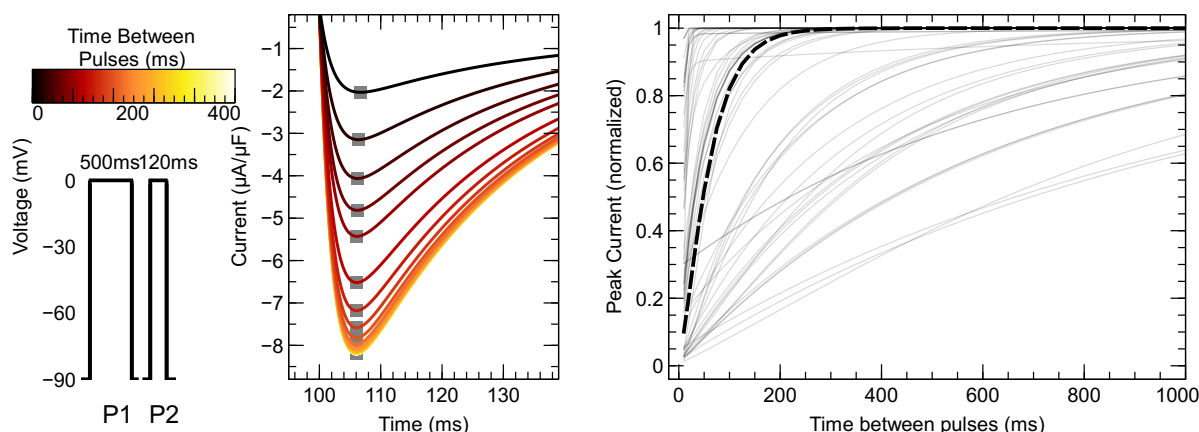## Recovery from voltage-dependent inactivation

Figure 10: **Left**: Voltage-clamp used to characterise recovery from inactivation with a variable time interval between P1 and P2 of 10, 20, 30, 40, 50 ms and increment steps of 25 ms thereafter until 1000 ms (see main text for details). **Centre**: Example of I_{CaL} predictions during P2, using the model by Grandi et al. (2010). The colours of each line match the colour shown above the interval length in the left panel. Traces from successive sweeps are overlaid and the peak I_{CaL} is marked at each sweep which is used to construct the curves on the right. This process of constructing a peak I_{CaL} versus time curve is shown in the animation online at https://github.com/CardiacModelling/ical-model-comparison. **Right**: Normalised peak I_{CaL} versus time curves for all 60 models. The prediction from Fink et al. (2008) is close to the median response across all models and is highlighted with a black dashed line. The simulation results for all of the models can be compared on the Cardiac Electrophysiology Web Lab at https://bit.ly/LtypeCa.

In the previous section we investigated the voltage at which the I_{CaL} channels inactivate. In this section, we look at the time I_{CaL} channels take to recover from inactivation, using a protocol adapted from Fülöp et al. (2004) and shown in Figure 10 (left). Each sweep starts with 10 s at a holding potential of -90 mV, followed by a 500 ms step (P1) to a conditioning potential of 0 mV. The potential is then set back to -90 mV for a duration that varies from sweep to sweep, followed by a 120 ms second step (P2) to the conditioning potential. The interval duration is 10 ms for the first sweep and increases by 10 ms per sweep up to 50 ms, after which it increases by 25 ms per sweep up to 1000 ms (a subset of which are shown in the figure).

Peak I_{CaL} was recorded during P1 ($I_{\text{conditioning}}$) and P2 (I_{test}) for all sweeps (Figure 10, centre). This was normalised as $\bar{I} = I_{\text{test}}/I_{\text{conditioning}}$ and the normalised peak I_{CaL} ($\bar{I}$) was plotted against interval length to construct the current-time curves shown in figure 10 (right).

An exponential function $1 - \exp(-t/\tau)$ was fitted to each model's current-time curve to yield the time constant of recovery from inactivation τ. This τ varies between 1.4 to 995.7 ms for the models in this study while the median τ is 51.2 ms. This is much faster than examples from ventricular cells at physiological temperature, in which τ ranged from 50 to 700 ms (Li et al., 1999; Kim et al., 2016).

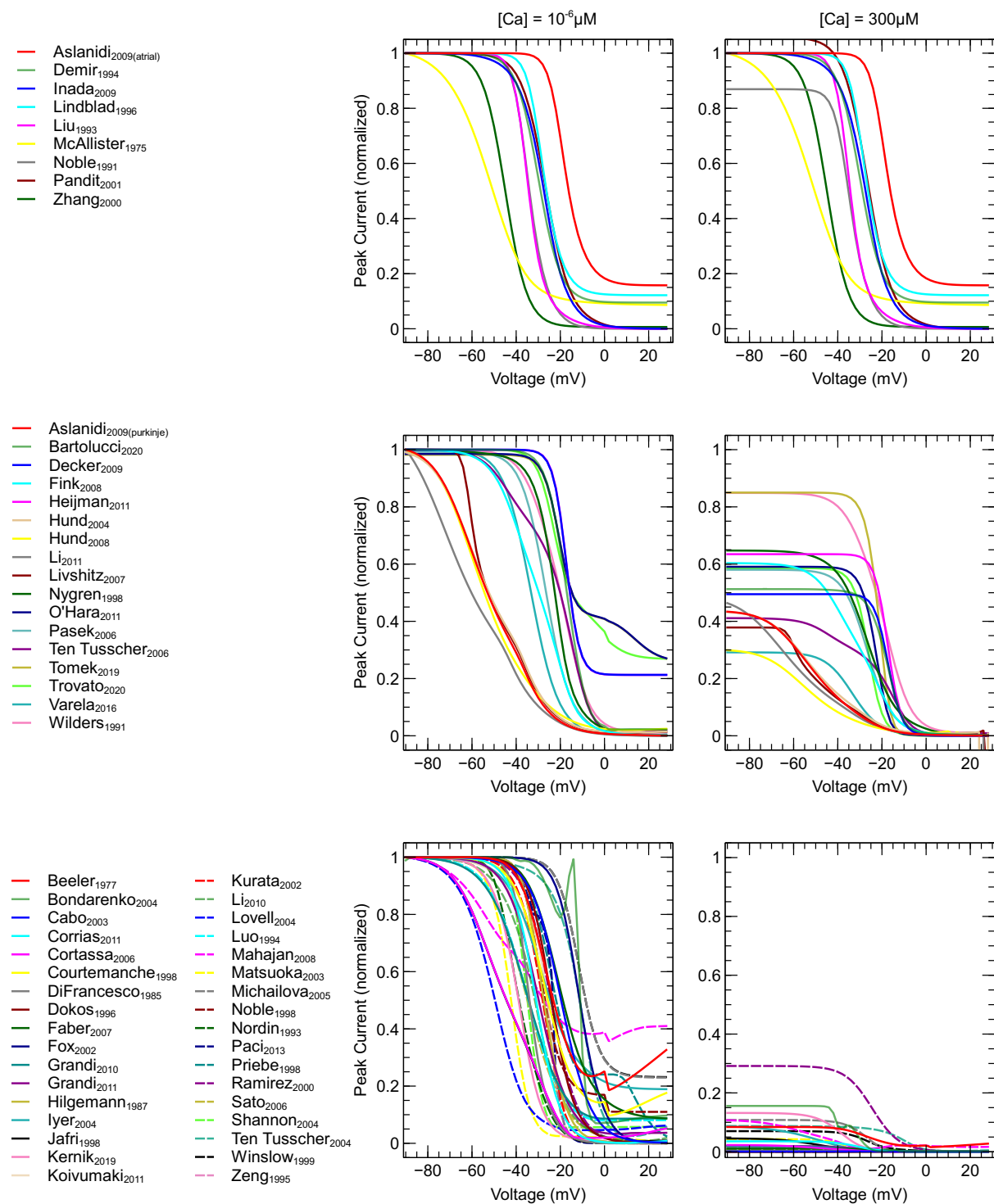# Calcium-dependent inactivation

Figure 11: Models predict substantial variation in inactivation levels for the same change in $[Ca^{2+}]$ as shown by the simulation to the inactivation protocol using **Left**: internal $[Ca^{2+}]$ of $10^{-6}\,\mu$M and **Right**: internal $[Ca^{2+}]$ of $300\,\mu$M. The models have been grouped intro three categories **Top**: insensitive or weakly sensitive to $[Ca^{2+}]$ (9 models), **Middle**: mildly sensitive to $[Ca^{2+}]$ (17 models), and **Bottom**: strongly sensitive to $[Ca^{2+}]$ (34 models). The simulation results for all of the models can be compared on the Cardiac Electrophysiology Web Lab at https://bit.ly/LtypeCa.

To study calcium-dependent inactivation (CDI), we compared the predicted response of the inactivation protocol shown in Figure 9 at internal calcium concentrations of $10^{-6}\,\mu$M and $300\,\mu$M. These concentrations are representative of the wide physiological variation of $[\text{Ca}^{2+}]$ in cardiomyocytes, which ranges from 1–$10\,\mu$M during low activity but may be greater than $100\,\mu$M in the dyadic space during high activity (Fearnley et al., 2011). As before, the peak I_{CaL} was identified at each sweep for both experiments, but the normalisation was performed using the maximum magnitude of peak I_{CaL} measured across both concentrations.

Figure 11 shows the resulting I-V curves for the two experimental conditions split into three categories: 1) insensitive or weakly sensitive to $[\text{Ca}^{2+}]$, 2) mildly sensitive, and 3) strongly sensitive to $[\text{Ca}^{2+}]$. To make these categories, we introduce a mathematical quantity that measures the change in I_{CaL} predictions at the two $[\text{Ca}^{2+}]$

$$\text{RMSD} = \sqrt{\frac{\sum\limits_{i=1}^{n} \left(\bar{\text{I}}_{300} - \bar{\text{I}}_{10^{-6}}\right)^2}{n}}, \tag{6}$$

where RMSD stands for root mean squared difference and n is the total number of sweeps. We classified a model as weakly sensitive if RMSD < 0.1, mildly sensitive if $0.1 \leq$ RMSD ≤ 0.5, and strongly sensitive if RMSD > 0.5. We thus identified 17 models in this study that show mild sensitivity to $[\text{Ca}^{2+}]$ and 34 models that show strong sensitivity. Of the remaining 9 models, only Noble et al. (1991) and Pandit et al. (2001) account for $[\text{Ca}^{2+}]$ in their equations and so are weakly sensitive, while the remaining 7 are $[\text{Ca}^{2+}]$ insensitive and do not have any $[\text{Ca}^{2+}]$ terms in O or D (see Table 1, Row 1).

Although most models show CDI, there is large variation in the degree of CDI to the same change in $[\text{Ca}^{2+}]$. To investigate this further, we examined the $[\text{Ca}^{2+}]$ that induces the same level of inactivation in the models sensitive to $[\text{Ca}^{2+}]$. For this purpose, we used a protocol consisting of only the first sweep of the inactivation protocol shown in Figure 9. As before, peak I_{CaL} was recorded during P2, but now the experiment was repeated for increasing $[\text{Ca}^{2+}]$ until a 50% drop in the peak I_{CaL} was observed; we termed this concentration the IC_{50} $[\text{Ca}^{2+}]$. In this manner, we calculated the IC_{50} concentration for 49 models. No IC_{50} could be obtained for the model by Wilders et al. (1991) and Nygren et al. (1998), which did not produce a 50% drop at any of the levels we tested.

Calcium flowing into a subspace will induce a change in local $[\text{Ca}^{2+}]$ with a rate that depends inversely on the subspace volume V_{local} (assuming there is no buffering or diffusion of $[\text{Ca}^{2+}]$). We may therefore expect models in which I_{CaL} flows into large subspaces to compensate for the slower local $[\text{Ca}^{2+}]$-change with a more sensitive CDI, and vice versa. This is affirmed by Figure 12, in which the IC_{50} concentration is plotted against V_{local}. For models in which I_{CaL} channels are present in multiple biological subspaces, the volume was calculated as a weighted average. For example, 80% of the I_{CaL} channels in the model by Tomek et al. (2019) lie in the dyadic space, whereas only 20% lie in the submembrane space, leading to a weighted average volume $V_{\text{local}} = 0.8V_d + 0.2V_s$. The models by Beeler and Reuter (1977) and Mahajan et al. (2008) were omitted as the volume of their localisation space could not be determined from the manuscripts.

Figure 12 shows a weak correlation between the predicted IC_{50} and the corresponding V_{local}, suggesting that modelled CDI is to some limited extent influenced by the size of the compartment that I_{CaL} flows into. This is another example where we observe that one aspect of the model can compensate for another.
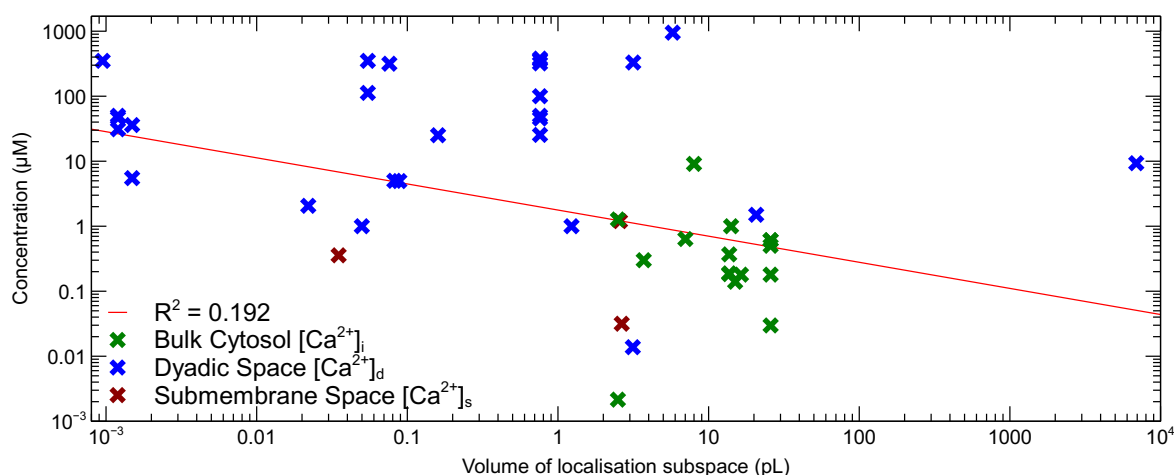
Figure 12: IC_{50} concentration plotted against the volume of the biological subspace assumed to contain L-type calcium channels by 47 models (see main text for details). Colours indicate the subspace containing I_{CaL} channels, or the subspace containing the majority of channels in models where I_{CaL} is spread over multiple spaces.
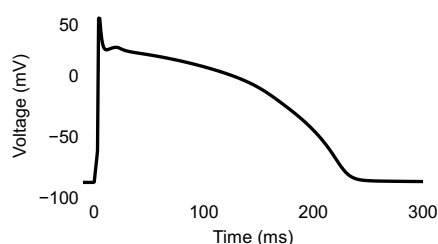
Action potential clamp

Figure 13: The AP waveform used in AP- and AP-CaT-clamp simulations. This action potential was derived from a 1 Hz simulation of the model by Grandi et al. (2010).

The experiments simulated so far use voltage-step protocols which bring out a wide range of I_{CaL} kinetics but are very different from the voltage signals experienced by L-type calcium channels *in situ*. To compare predictions of I_{CaL} in more physiological conditions, we simulated experiments in which the membrane potential (V_m) is clamped to an action potential (AP) trace.

As noted before, assumptions about internal calcium dynamics will impact the (estimated or calibrated) parameters governing I_{CaL} kinetics, and so to show the I_{CaL} predictions from a whole *AP model* as fairly as possible, the internal calcium concentrations in these simulations should be allowed to vary as defined by the model equations. If, however, we are interested only in the models' I_{CaL} equations, it is preferable to force an identical internal calcium transient in each model.

To address these conflicting aims, we performed a series of three complementary simulations. First, we simulated an AP-clamp in which we allowed the internal $[Ca^{2+}]$ to vary according to the model's internal $[Ca^{2+}]$ equations (**AP clamp 1**). These simulations were performed only for models in which a CellML file for the full AP model was available. For AP models with epi-, endo-, and mid-myocardial variants, the epicardial version was used. Secondly, we performed a dual AP-CaT-clamp, in which all internal $[Ca^{2+}]$ (including the subspaces) were clamped to the same pre-calculated bulk cytosolic CaT (**AP clamp 2**). Thirdly, we performed a combined AP-CaT-clamp in which bulk cytosol, submembrane space, and dyadic

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space $[Ca^{2+}]$ were clamped to pre-calculated transients appropriate to the subspace (**AP clamp 3**). We chose to use the AP and CaT measurements from the Grandi et al. (2010) human ventricle model during 1 Hz at steady pacing of the model (Figure 13, 3), as this is the earliest human model in which all three subspaces are defined. In all three experiments, the simulated I_{CaL} was normalised with respect to the total charge carried: $\bar{I}(t) = I(t)/|\int_t I(t)dt|$. The resulting normalised currents for all three simulations are shown in Figure 14.
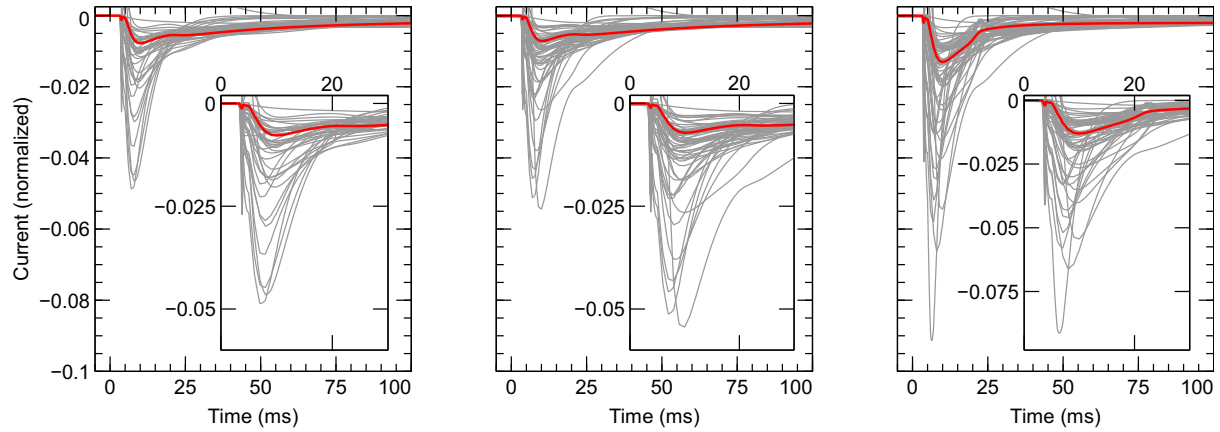
Figure 14: Variation in the I_{CaL} predictions in response to AP and AP-CaT clamp. **Left**: Simulated response to AP clamp 1, in which internal $[Ca^{2+}]$ are determined by the model equations, shown for the 44 I_{CaL}-models implemented in a whole-cell model. **Centre**: Simulated response to AP clamp 2, in which all internal $[Ca^{2+}]$ are clamped to a pre-calculated bulk cytosolic CaT. **Right**: Simulated response to AP clamp 3, in which $[Ca^{2+}]_i$, $[Ca^{2+}]_s$, and $[Ca^{2+}]_d$ are clamped to pre-calculated bulk cytosolic, submembrane, and dyadic CaT respectively. Predictions from Grandi et al. (2010), which was used to derive the calcium transients, is highlighted in red. The simulation results for all of the models can be compared on the Cardiac Electrophysiology Web Lab at https://bit.ly/LtypeCa.

All three AP clamps in Figure 14 show considerable variation in predicted (normalised) I_{CaL} between models. Some of this variation may be explained as a result of differences in species, cell-type, and other factors. To test this assumption, we divided the 60 models into groups according to several criteria (e.g. species, cell-type) and investigated whether this resulted in groups with reduced variation. We chose the "compromise" protocol AP Clamp 3 for this purpose. To remove effects of varying driving terms and maximal conductances, we compared the predicted open probability (O) rather than I_{CaL}.

To give an indication of the variation within a group, we used the "normalised root mean square difference" (NRMSD) of the observed open probabilities of all models in the group, according to:

$$\hat{O}_i = \frac{1}{n}\sum_{j=1}^{n} O_{ij}; \ \ \mathrm{NRMSD}_{\mathrm{group}} = \sqrt{\frac{1}{m \cdot n}\sum_{i=1}^{m}\sum_{j=1}^{n}\left(O_{ij} - \hat{O}_i\right)^2}. \tag{7}$$

Here, O_{ij} represents the open probability measured in response to the "AP-CaT clamp 3" protocol at the ith time step for the jth model, m is the total number of time points, and n is the total number of models within the group.

If grouping by a particular category reduces variability, we expect the NRMSD within each group to be lower than the NRMSD of the original group-of-all-models ($\mathrm{NRMSD}_{\mathrm{total}} = 0.139$). This can be quantified by defining a relative measure $\mathrm{NRMSD}_{\mathrm{relative}} = \mathrm{NRMSD}_{\mathrm{group}}/\mathrm{NRMSD}_{\mathrm{total}}$. A grouping is considered to be better than baseline if its $\mathrm{NRMSD}_{\mathrm{relative}}$ is less than one.

First, we investigate the effects of grouping models chronologically by grouping each model into one of four categories depending on the year of publication. This is shown in Figure 15, where we can observe some convergence in model predictions over time, indicated by a decreasing $NRMSD_{relative}$. Although this is encouraging, some degree of convergence should be expected as more recent models are often refinements of previous models in the same age category. Large variability should also expected from the models published before the 1990s, which depend on data obtained from a wider range of experimental techniques.
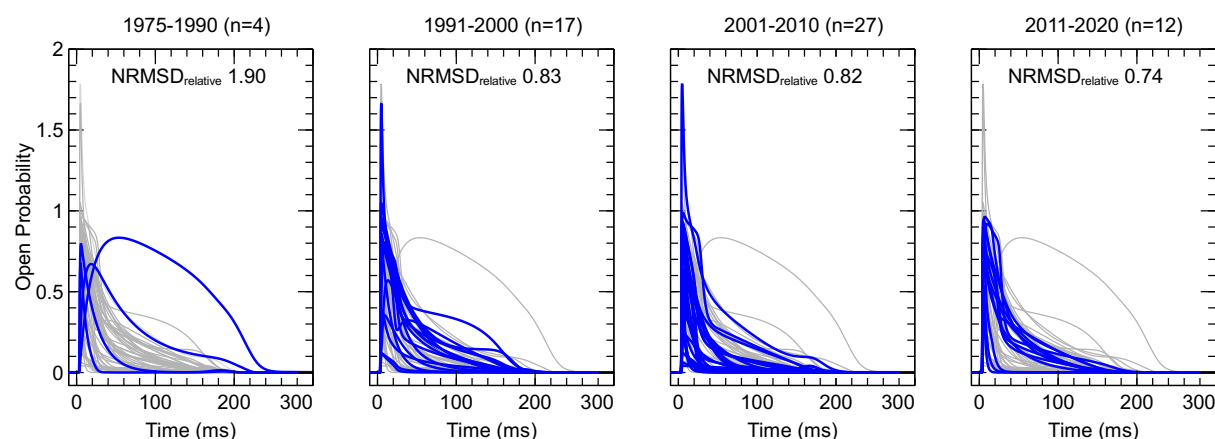
Figure 15: Open probability in response to AP clamp 3, grouped according to date of publication, shows a degree of convergence over time. Blue curves in each panel correspond to I_{CaL} predictions of models within the corresponding period, while the remaining predictions are shown in grey.

Next, we grouped models according to the approach used to model how the calcium concentrations affect the open probability, depicted by the rows in Table 1. On this basis, Figure 16 shows the models grouped into 6 classes: no $[Ca^{2+}]$ (row 1, 2), $[Ca^{2+}]_i$ (row 3, 6), $[Ca^{2+}]_s$ (row 4, 7), $[Ca^{2+}]_d$ (row 5, 8, 11, 12), $[Ca^{2+}]_i$ and $[Ca^{2+}]_d$ (row 9), and $[Ca^{2+}]_s$ and $[Ca^{2+}]_d$ (row 10). It shows that that most groups formed on the basis of the local $[Ca^{2+}]$ near the I_{CaL} channel have at least ~20% less disagreement amongst the predictions across models than the baseline. This indicates that the modelled localisation of the I_{CaL} channels plays an important role in determining model predictions. However, only the model by Tomek et al. (2019) is shown in class 5 and thus the $NRMSD_{relative}$ calculated here is not relevant. Similarly, all three models in class 6 (Shannon et al., 2004; Grandi et al., 2010, 2011) were developed by the same group.
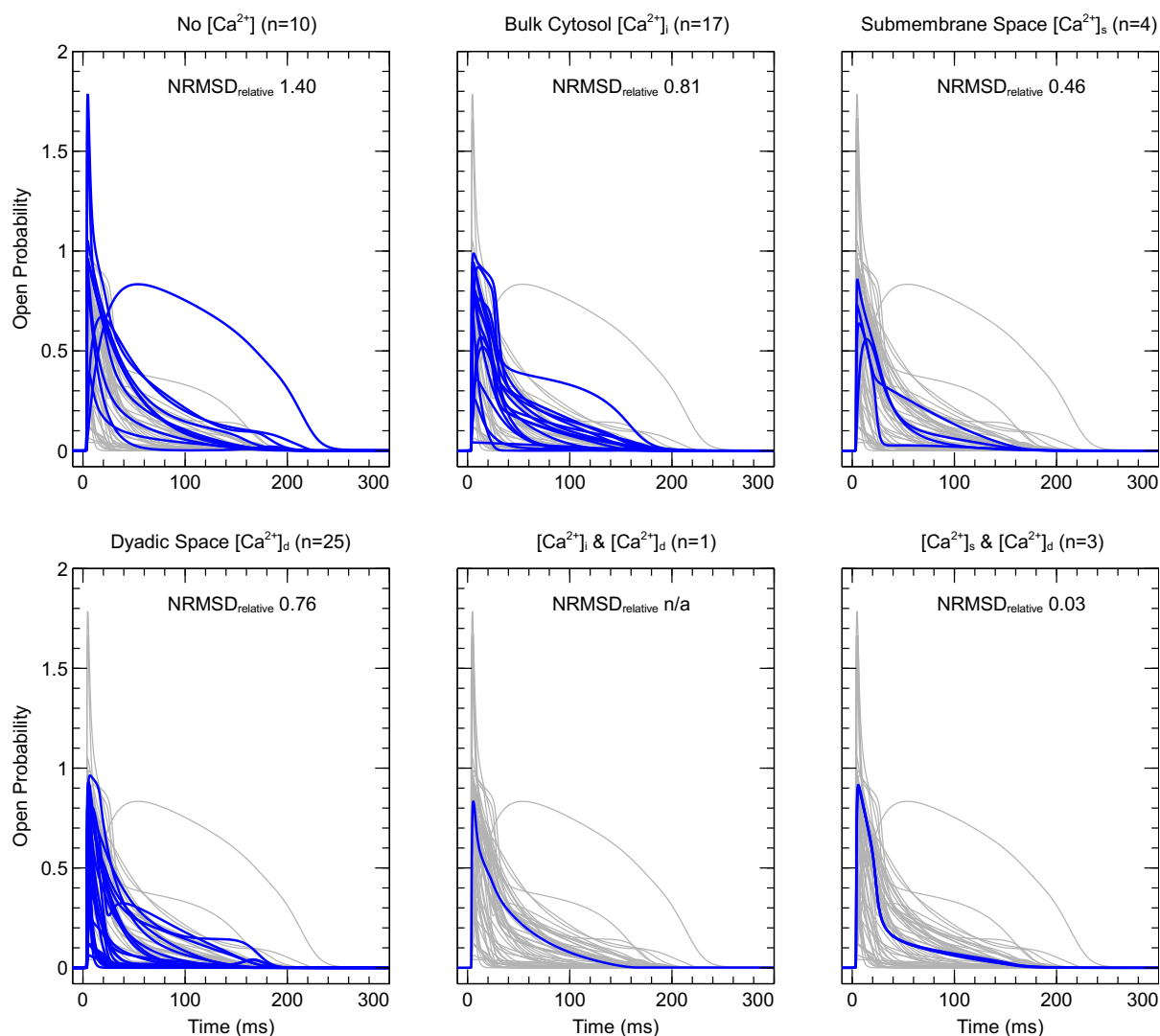
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Figure 16: Open probability (O) in response to AP Clamp 3, grouped by local $[Ca^{2+}]$ as shown by the rows in Table 1 where each row represents an O or driving term dependence on different local $[Ca^{2+}]$. In this figure each panel includes the models in 1) row 1 & 2, 2) row 3 & 6, 3) row 4 & 7, 4) row 5, 8, 11, & 12, 5) row 9, and 6) row 10 (where the model is implemented quantitatively) of Table 4. In each panel, blue curves show I_{CaL} predictions from models within the corresponding group, while the remaining predictions are shown in grey.

We also investigated grouping the models by species (e.g. human, canine), cell type (e.g. ventrical, purk-inje), and gating kinetics (e.g. Type A, C). Groups on the basis of these factors led to small improvements on the baseline, but no major reductions in the $NMRSD_{relative}$ were seen except in the group of canine models (n=14) which had $NMRSD_{relative} = 0.62$. Of all tested criteria, grouping by local $[Ca^{2+}]$ near the I_{CaL} channels exhibited the most consistent predictions.

Discussion

In this study we have undertaken a qualitative comparison of 71 I_{CaL} models, and simulated experimental protocols with 60 models to enable a quantitative comparison. In our qualitative analysis, we found 15 major categories of I_{CaL} gating models, and a smaller but similar lack of consensus on how to model I_{CaL}'s electrochemical driving force and the myocyte's spatial organisation. Accordingly, the 60 models studied quantitatively made very different predictions about activation, inactivation, recovery, and CDI, with only limited convergence emerging with year of publication. So, despite decades of intensive and careful research, it is still very much an open question as to how to formulate a model of I_{CaL} for use in electrophysiology simulations.

Interestingly, and despite its critical role in cardiac function, very little work has been published that compares models of I_{CaL} or shows the benefits of a newly introduced model over its predecessors (but see Luo and Rudy, 1994, for an example). Therefore, when undertaking a new study involving I_{CaL}, there is a need to carefully assess which of the existing 71 models most accurately represents the experimental record on the current of interest (e.g. human non-diseased left-ventricular I_{CaL}). This is a time-consuming and daunting task, especially if we consider that the model that best matches the data "out of the box" may be surpassed by other models after re-parameterisation. Clearly, it would be of great benefit to the field of (computational) electrophysiology if a well-tested consensus model or at least a "gold-standard" model were to emerge.

In this section, we show how dissecting I_{CaL} models into smaller components can facilitate model comparison, but can also expose problems in individual parts. We then highlight open questions in models of the driving term, calcium-sensitivity and voltage-dependent kinetics and speculate on possible solutions.

Compensation

A major difficulty when comparing I_{CaL} models is that, although they share a common structure, their driving term (D), voltage-dependent kinetics, and calcium sensitivity interact in ways that allow irregularities in one aspect to be compensated in another. For example the unusual open probability (O) of the model by Priebe and Beuckelmann (1998) (Figure 8) was shown to be compensated by a large reversal potential in its driving term (Figure 6). Similarly, the models by Demir et al. (1994), Lindblad et al. (1996), and Aslanidi et al. (2009a) allow O to be greater than one (so that the usual interpretation of open probability does not apply), which can be compensated for in either D or the maximal conductance. The model by Beeler and Reuter (1970) has a strong sensitivity to $[Ca^{2+}]$ (Figure 11) but does not include CDI, deriving its $[Ca^{2+}]$-dependence from an unusually strong driving force (Figure 6) instead. Finally, Figure 12 shows how a high sensitivity to calcium can be compensated by postulating a bigger subspace near the L-type calcium channels, leading to a lower local $[Ca^{2+}]$.

Compensation effects also come into play when creating new AP models, which often require calibration of the sub-models (e.g. the I_{CaL} model) to cell-level observations (Whittaker et al., 2020). Even when carried out with care, this process may hide defects in one part of a model by introducing them in another. A model built in this way may reproduce many electrophysiological phenomena seen in the experimental data, but through mechanisms that do not reflect those in the real cell. As a result, when extrapolating to new (e.g. patho-physiological) situations, there is a likelihood that its predictions will be unreliable.

Driving term

The study of the electrochemical force driving I_{CaL} flux through the open channels is complicated by the wide range of calcium concentrations in a myocyte and by the L-type calcium channel's significant permeability to potassium and sodium. Different models have been proposed as a result (Ohmic and several GHK variants), but we were unable to find studies that show the benefit of one form over another. The relative permeability to different ionic species also varies between models (Table 4), as do the activity coefficients used in some GHK models. It is important to note that, while almost all these models used the same activity coefficients, their values depend on experimental conditions (ionic strength and temperature), for different intracellular and extracellular ionic compositions. They can also be calculated as part of the model, as was done by Tomek et al. (2019) (although this model erroneously used a natural logarithm instead of a base-10 logarithm for the Davies activity coefficient calculation, see `https://bit.ly/3tqD4gP`), however, within physiological ranges of temperature and ionic concentrations, they change by less than 0.1% during an action potential.

To decide between driving force models, specialised experiments may be required that can separate driving force from kinetics and CDI. For example, if some way can be found to fix the channels in their open state (e.g. a drug or mutation) it may be possible to measure an open-state I-V relationship directly in a whole-cell configuration. If noise levels can be made sufficiently low then single-channel experiments, (in which the kinetics do not affect the current level) may also be useful for this purpose (Greenstein and Winslow, 2002). Excised-patch experiments could have additional advantages, in that they could allow rapid variation of internal (inside-out) or external calcium concentrations (outside-out), to levels that a whole cell may not tolerate, and in removing obfuscating effects from intracellular buffers and transporters (Gradogna et al., 2009). Finally, it is worth noting that the Ohmic and GHK models are both approximations, and so it may be possible to fit them to predictions from (or use) more sophisticated models of ionic permeation (Roux et al., 2004).

CDI and calcium dynamics

Calcium-dependent inactivation (CDI) is one of the most challenging aspects of modelling I_{CaL}. Accordingly, the degree of CDI predicted by different models varies very widely (Figure 11). That this is not just a quantitative difference can be seen in Figure 5, which shows examples where CDI is treated as an independent process and examples where voltage and calcium-dependent gating are intermixed. CDI depends on the (fluctuating) calcium concentration at the cytosolic channel side, and so model assumptions about channel localisation and cell geometry have a strong impact on modelled CDI. This is evidenced by the relationship between subspace volume and IC_{50} (Figure 12) and by the reduction in NMRSD when grouping models by channel localisation.

Experimentally, CDI can be separated from voltage-dependent kinetics and driving term to some degree by using voltage protocols with a single repeating step, so that voltage effects are consistent — if still unknown. However, the local calcium concentration is difficult to control, as the very low $[Ca^{2+}]$ maintained in living cells means the calcium influx through I_{CaL} causes a significant change. In myocytes, a bewildering array of processes affect and are affected by local $[Ca^{2+}]$ (Bers, 2008). In heterologous expression systems, calcium-buffers are required to keep $[Ca^{2+}]$ at levels the cells can tolerate (You et al., 1997). Bulk cytosolic $[Ca^{2+}]$ can be measured optically using fluorescent dyes (Herron et al., 2012) but measuring local calcium elevations in subspaces (or "microdomains") is technically challenging (Acsai et al., 2011). As a result, there is no 'simple' set-up in which CDI can be studied, and analysing data from experiments targeting CDI requires consideration of intracellular $[Ca^{2+}]$ gradients, diffusion, and buffering. Although analytical solutions exist for simplified scenarios (Smith, 1996), it is likely that

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Voltage-dependent kinetics

The equations for (voltage and calcium-dependent) open probability vary more from model to model than those for any other aspect of I_{CaL}: we identified 15 distinct gating mechanisms, several of which had further sub-types. Some mechanisms have clearly developed over time to account for novel experimental information: for example, the transition of gating type A to B to C in Table 2 directly relates to the discovery of calcium-dependent inactivation (CDI) in I_{CaL} channels. However, we found that the introduction of new gating models is not commonly accompanied by a published critical comparison of the old and new models on the data set of interest. In part 2 of this study we showed that there is large variability in the predicted response to voltage-clamp protocols, which cannot be explained by differences in species or cell type. Without further systematic analysis it is unclear how much of this variability is due to modelling challenges, and how much is due to variability in the underlying experimental data sets.

While most studies of I_{CaL} kinetics have used conventional voltage-step protocols (such as shown in Figures 7, 9, and 10), recent advances in protocol design for I_{Kr} (Beattie et al., 2018; Clerx et al., 2019) may be translatable to I_{CaL}. Application of such protocols in high-throughput settings (Lei et al., 2019) with careful consideration of experimental artefacts (Lei et al., 2020a,b) may help produce rich data sets that will allow us to distinguish between the different proposed gating mechanisms and study (biological or experimental) variability. Such an approach, however, would require that voltage and calcium effects are independent (or at least can be studied independently) and may rely on accurate CDI and driving term models already being available. Alternatively, it may be possible to derive gating models as simplifications of more detailed molecular dynamics models (Silva, 2018; Ramasubramanian and Rudy, 2018). In either case, care must be taken to create independent training and validation data sets, so that the most crucial part of the gating model, its predictive power, can be assessed (Whittaker et al., 2020).

Data sharing

Finally, we have surveyed and compared models of I_{CaL} without much referral to what is perhaps the most important criterion: do they match the data. As we have chosen the broad field of "mammalian models" of I_{CaL}, from anywhere in the heart, there is no single data set that all models should match. However, L-type calcium channel genes are strongly conserved, so that it seems likely that cell-type differences and even species differences may be accommodated by modifying parameter values, rather than requiring different equations. This way, a systematic comparison could be carried out that tested the ability of the 60 sets of model equations to fit a specific data set.

An immediate issue here is the lack of publicly available data. Although the need for sharing data (and sufficient meta data) is widely acknowledged (Quinn et al., 2011) and technical barriers have all but disappeared in the last two decades, it is still uncommon for electrophysiological recordings to be published in digital, unprocessed, form. As a result, modellers have frequently resorted to digitising published figures and then fitting to "summary curves" (e.g. I-V curves) that represent averaged data from several cells in a condensed form. Both averaging (Golowasch et al., 2002) and fitting to summary curves (Clerx et al., 2019) can lead to inaccuracies, so there is an evident need for more widespread sharing of experimental data, perhaps in a systematic form such as the Physionet database for ECG signals (Goldberger et al., 2000).

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Conclusion

Five decades of careful research has resulted in a list of over 71 mammalian I_{CaL} models, which make varying assumptions and predictions about the electrochemical driving force, voltage and calcium-dependent gating, and channel localisation. Despite this impressive body of work, there are still several, fundamental, open questions on how to model I_{CaL}. We believe that this study is the first to systematically survey and compare I_{CaL} models and hope that it can serve as a starting point for a critical re-assessment of L-type calcium current modelling from which a synthesised, consensus model may emerge.

Additional information

Data availability

Code for all models and simulations is freely available at https://github.com/CardiacModelling/ical-model-comparison.

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Competing interests

K.W. and L.P. are employees of F.Hoffman-La Roche Ltd. and K.W. is a shareholder.

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