## Dynamical effects of calcium-sensitive potassium currents on voltage and calcium alternans

Matthew Kennedy<sup>2</sup> (D), Donald M. Bers<sup>1</sup> (D), Nipavan Chiamvimonvat<sup>3,4</sup> (D) and Daisuke Sato<sup>1</sup> (D)

<sup>1</sup>Department of Pharmacology, University of California, Davis, CA, USA

<sup>2</sup>Department of Biomedical Engineering, University of California, Davis, CA, USA

<sup>3</sup>Division of Cardiovascular Medicine, Department of Internal Medicine, University of California, Davis, CA, USA

<sup>4</sup>Department of Veterans Affairs, Northern California Health Care System, Mather, CA, USA

### Key points

- A mathematical model of a small conductance Ca<sup>2+</sup>-activated potassium (SK) channel was developed and incorporated into a physiologically detailed ventricular myocyte model.
- Ca<sup>2+</sup>-sensitive K<sup>+</sup> currents promote negative intracellular Ca<sup>2+</sup> to membrane voltage (CA<sub>i</sub><sup>2+</sup>  $\rightarrow$  V<sub>m</sub>) coupling.
- Increase of Ca<sup>2+</sup>-sensitive K<sup>+</sup> currents can be responsible for electromechanically discordant alternans and quasiperiodic oscillations at the cellular level.
- At the tissue level, Turing-type instability can occur when Ca<sup>2+</sup>-sensitive K<sup>+</sup> currents are increased.

Abstract Cardiac alternans is a precursor to life-threatening arrhythmias. Alternans can be caused by instability of the membrane voltage  $(V_m)$ , instability of the intracellular Ca<sup>2+</sup> (Ca<sup>2+</sup><sub>i</sub>) cycling, or both.  $V_{\rm m}$  dynamics and  $Ca_{\rm i}^{2+}$  dynamics are coupled via  $Ca^{2+}$ -sensitive currents. In cardiac myocytes, there are several  $Ca^{2+}$ -sensitive potassium (K<sup>+</sup>) currents such as the slowly activating delayed rectifier current ( $I_{\rm Ks}$ ) and the small conductance Ca<sup>2+</sup>-activated potassium (SK) current  $(I_{\rm SK})$ . However, the role of these currents in the development of arrhythmias is not well understood. In this study, we investigated how these currents affect voltage and  $Ca^{2+}$  alternans using a physiologically detailed computational model of the ventricular myocyte and mathematical analysis. We define the coupling between  $V_{\rm m}$  and  ${\rm Ca}_{\rm i}^{2+}$  cycling dynamics ( ${\rm Ca}_{\rm i}^{2+} \rightarrow V_{\rm m}$  coupling) as positive (negative) when a larger Ca<sup>2+</sup> transient at a given beat prolongs (shortens) the action potential duration (APD) of that beat. While positive coupling predominates at baseline, increasing  $I_{Ks}$  and  $I_{SK}$  promote negative  $Ca_i^{2+} \rightarrow V_m$  coupling at the cellular level. Specifically, when alternans is Ca<sup>2+</sup>-driven, electromechanically (APD-Ca<sup>2+</sup>) concordant alternans becomes electromechanically discordant alternans as  $I_{\rm KS}$  or  $I_{\rm SK}$  increase. These cellular level dynamics lead to different types of spatially discordant alternans in tissue. These findings help to shed light on the underlying mechanisms of cardiac alternans especially when the relative strength of these currents becomes larger under pathological conditions or drug administrations.

(Resubmitted 13 October 2016; accepted after revision 22 November 2016; first published online 30 November 2016) **Corresponding author** D. Sato: Department of Pharmacology, University of California, Davis, CA, USA. Email: dsato@ucdavis.edu

**Abbreviations** AP, action potential; APD, action potential duration;  $Ca_i^{2+}$ , intracellular  $Ca^{2+}$ ; DI, diastolic interval;  $g_{ks}$ , slowly activating delayed rectifier conductance;  $g_{sk}$ , small conductance  $Ca^{2+}$ -activated potassium conductance;  $I_{Ks}$ , slowly activating delayed rectifier current;  $I_{CaL}$ , L-type  $Ca^{2+}$  current;  $I_{SK}$ , small conductance  $Ca^{2+}$ -activated potassium current; NCX, Na<sup>+</sup>–Ca<sup>2+</sup> exchanger; PCL, pacing cycle length; SR, sarcoplasmic reticulum;  $V_m$ , membrane voltage.

### Introduction

Ventricular arrhythmia is a major cause of sudden cardiac death. It has been shown that a precursor to life-threatening arrhythmia formation is the development of cardiac alternans, a sequence of paired long and short action potentials (APs) (Pastore et al. 1999; Garfinkel et al. 2000; Fox et al. 2002b; Hayashi et al. 2007; Groenendaal et al. 2014). However, physiological and dynamical mechanisms are not fully understood (Weiss et al. 2006, 2011; Wilson et al. 2006; Laurita & Rosenbaum, 2008; Merchant & Armoundas, 2012; Sato & Clancy, 2013; Kanaporis & Blatter, 2015; Valdivia, 2015). At the cellular level, alternans can be caused by instability of membrane voltage  $(V_m)$  due to steep action potential duration (APD) restitution (Nolasco & Dahlen, 1968; Hayashi et al. 2007), instability of intracellular calcium  $(Ca_i^{2+})$  cycling due to steep sarcoplasmic reticulum (SR)  $Ca^{2+}$  release dependence on  $Ca^{2+}$  load/refractoriness, or both (Chudin et al. 1999; Shiferaw et al. 2003, 2005; Picht et al. 2006; Groenendaal et al. 2014; Wang et al. 2014). Dynamical systems of  $V_m$  and  $Ca_i^{2+}$  are coupled via  $Ca^{2+}$ -sensitive currents. We previously investigated the role of the major  $Ca^{2+}$ -sensitive currents, the L-type  $Ca^{2+}$  current ( $I_{CaL}$ ) and sodium( $Na^+$ )– $Ca^{2+}$  exchanger (NCX) (Shiferaw et al. 2005; Sato et al. 2006, 2007, 2013). However, the slowly activating delayed rectifier current  $(I_{Ks})$  is a Ca<sup>2+</sup>-sensitive current, and recent experimental studies showed that the small conductance Ca<sup>2+</sup>-activated potassium (SK) channels exist in cardiac myocytes and play an important role in regulating APs (Xu et al. 2002; Tuteja et al. 2005; Zhang et al. 2008; Li et al. 2009; Hsueh et al. 2013; Chang et al. 2013a; Chang & Chen, 2015; Yu et al. 2015; Zhang et al. 2015). Yet, little is known about the role of these Ca2+-sensitive K+ currents in the formation of alternans. In this study, we investigate dynamical effects of Ca<sup>2+</sup>-sensitive K<sup>+</sup> currents on V<sub>m</sub> and Ca<sub>i</sub><sup>2+</sup> alternans and show how ion channel/current level modifications lead to various phenomena at cellular and tissue levels including electromechanically (APD–Ca<sup>2+</sup>) discordant alternans and spatially discordant alternans.

### Methods

In order to investigate the dynamical and physiological mechanisms of alternans, we used a physiologically detailed mathematical model of AP and  $Ca_i^{2+}$  cycling of the ventricular myocyte developed by Shiferaw *et al.* (2005). Figure 1*A* shows the schematic diagram of the currents and fluxes that regulate  $V_m$  dynamics and  $Ca_i^{2+}$  cycling. The membrane potential is governed by

$$\frac{\mathrm{d}V_{\mathrm{m}}}{\mathrm{d}t} = -\frac{\sum I}{C_{\mathrm{m}}},$$

where  $V_{\rm m}$  is the membrane potential,  $C_{\rm m}$  is the cell capacitance and *I* represents the transmembrane currents. The details of the model are described in the online Supporting information, Data S1.

The formula of the  $Ca^{2+}$  dependence of  $I_{Ks}$  from Mahajan *et al.* (2008) was incorporated into this model.  $I_{Ks}$  is given by

$$I_{Ks} = g_{ks} x_{s1} x_{s2} q_{Ks} \left( V_{m} - E_{Ks} \right),$$
$$q_{Ks} = 1 + \frac{0.8}{1 + \left( \frac{K_{m}}{c_{s}} \right)^{3}},$$

where  $g_{ks}$  is the maximum conductance of  $I_{Ks}$ ,  $q_{Ks}$  is the Ca<sup>2+</sup> dependence,  $x_{s1}$  and  $x_{s2}$  are the time-dependent gating variables,  $E_{Ks}$  is the reversal potential of  $I_{Ks}$ , and  $K_m$  controls the affinity of Ca<sup>2+</sup>. We varied  $g_{Ks}$  and  $K_m$  to explore the effects of  $I_{Ks}$  on alternans.

The SK channel has been recently described in atrial and ventricular myocytes (Xu *et al.* 2002; Tuteja *et al.* 2005; Zhang *et al.* 2008; Li *et al.* 2009; Hsueh *et al.* 2013; Chang *et al.* 2013*a*; Chang & Chen, 2015; Yu *et al.* 2015; Zhang *et al.* 2015). In this study we develop a novel computational model of the SK channel and integrate it with a physiologically detailed ionic model of a ventricular myocyte. We used the Ca<sup>2+</sup> dependence formulation by Hirschberg *et al.* (1998). The governing equations for the SK channel are

$$I_{SK} = g_{sk} x_{sk} (V_m - E_K)$$
$$x_{sk} = \frac{x_{sk\infty} - x_{sk}}{\tau_{sk}}$$
$$x_{sk\infty} = 0.81 \frac{c_s^n}{c_s^n - EC_{50}^n}$$
$$\tau_{sk} = \frac{1.0}{(0.047c_s + \frac{1}{76})}$$

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where  $g_{sk}$  is the maximum conductance,  $E_K$  is the reversal potential, and  $EC_{50}$  controls the affinity of  $Ca^{2+}$ . Several experimental studies have reported the EC<sub>50</sub> of the SK channel in cardiac cells. Hongyuan et al. have reported that the EC<sub>50</sub> of the SK channel in rat ventricles is 0.23–0.59  $\mu$ M (Hongyuan et al. 2016). Chang et al. have reported that the EC<sub>50</sub> of the SK channel in human ventricles is 0.35–0.6  $\mu$ M (Chang et al. 2013b). In this study, we varied the EC<sub>50</sub> from 0.1 to 1.0  $\mu$ M to cover the whole range of physiological and pathophysiological conditions. In experimental studies, the SK current  $(I_{SK})$  shows weak (or sometimes reverse) rectification (Lu et al. 2007; Zhang et al. 2008; Hsieh et al. 2013). Thus, in this study we chose a linear current-voltage relationship (Fig. 1B). Rectification properties can affect our results quantitatively. However, they did not affect our results qualitatively. Ca<sup>2+</sup> dependence and its time constant are plotted in Fig. 1C and D. Figure 1E shows



#### Figure 1. Physiologically detailed mathematical model

*A*, schematic diagram of the currents and fluxes that regulate  $V_m$  dynamics and  $Ca_i^{2+}$  cycling. *B*, model of the SK channel:  $I_{SK}$  vs.  $V_m$  when  $[Ca^{2+}]$  is 0.1, 0.5 and 1.0  $\mu$ M. *C*, channel open probability as a function of intracellular  $Ca^{2+}$ . *D*, inverse relationship between intracellular  $Ca^{2+}$  and the SK time constant ( $\tau_{SK2}$ ). *E*, open probability ( $P_o$ ) vs. time when various test  $[Ca^{2+}]$  pulses are applied.  $[Ca^{2+}]$  was changed from 0  $\mu$ M to test  $[Ca^{2+}]$  for 400 ms, and then changed to 0  $\mu$ M. *F*, transmembrane voltage plotted against time demonstrating the decrease in APD from baseline (red) to inclusion of the SK channel (black). When  $g_{sk} = 0.8 \ \mu$ S  $\mu$ F<sup>-1</sup> and EC<sub>50</sub> = 0.7  $\mu$ M are chosen, the model shows 12% difference of APDs, which was shown by Hsieh *et al.* experimentally (Hsueh *et al.* 2013), by copyright permission of the American Heart Association, Inc. *G*, positive and negative  $Ca_i^{2+} \rightarrow V_m$  coupling. *H*, electromechanically concordant (large APD $\rightarrow$ large  $Ca^{2+}$  transient, small APD $\rightarrow$ small  $Ca^{2+}$  transient) alternans.

the open probability ( $P_o$ ) of the SK channel when various test [Ca<sup>2+</sup>] pulses are applied. Some reported  $g_{sk}$  values in ventricular myocytes are as high as 10  $\mu$ S  $\mu$ F<sup>-1</sup> (Lu *et al.* 2007; Zhang *et al.* 2008; Chang *et al.* 2013*b*; Hongyuan *et al.* 2016), which would profoundly shorten APD. We have chosen a range of  $g_{sk}$  more conservatively (from 0.4 to 4  $\mu$ S  $\mu$ F<sup>-1</sup>), based on apamin effects on APD. Hsieh *et al.* showed a 12% prolongation of APD when apamin was applied (pacing cycle length, PCL = 300 ms, heart failure rabbit ventricular myocyte) (Hsueh *et al.* 2013). When  $g_{sk}$  is 0.8  $\mu$ S  $\mu$ F<sup>-1</sup> and EC<sub>50</sub> is 0.7  $\mu$ M, the model also showed 12% difference between AP with  $I_{SK}$  (Fig. 1*F* black) and AP without  $I_{SK}$  (Fig. 1*F* red).

Tissue simulations were performed in a mono-domain one-dimensional cable. The governing equation for the membrane potential  $V_{\rm m}$  of a cell in tissue is

$$C_{\rm m} \frac{{\rm d}V_{\rm m}}{{\rm d}t} = -I_{\rm ion} + I_{\rm coupling},$$

where  $C_{\rm m}$  is the membrane capacitance,  $I_{\rm ion}$  is the total ionic current through the membrane, and  $I_{\rm coupling}$  is the current that comes from the neighbouring cells through the gap junctions. This equation was solved by an operator splitting method (Qu & Garfinkel, 1999; Xie *et al.* 2004).

At the cellular level, alternans can be caused by instability of  $V_{\rm m}$  due to steep APD restitution. We call this  $V_{\rm m}$ -driven alternans. To alter the steepness of the restitution slope, we varied the time constant of the voltage-dependent inactivation of the L-type Ca<sup>2+</sup> channel ( $\tau_{\rm f}$ ) (Shiferaw *et al.* 2005). Alternans can also be caused by instability of Ca<sup>2+</sup><sub>i</sub> cycling due to a steep SR Ca<sup>2+</sup> release *vs*. SR Ca<sup>2+</sup> load relationship and Ca<sup>2+</sup> restitution properties. We call this Ca<sup>2+</sup><sub>i</sub>-driven alternans (Chudin *et al.* 1999; Shiferaw *et al.* 2003, 2005). To alter the instability of Ca<sup>2+</sup><sub>i</sub> cycling, we varied the gain of the SR Ca<sup>2+</sup> release function (*u*) (Shiferaw *et al.* 2005).

Coupling of  $Ca^{2+}$  on the APD ( $Ca_i^{2+} \rightarrow V_m$  coupling) is defined as positive (negative) if a large  $Ca^{2+}$  transient prolongs (shortens) the APD of the same beat (Shiferaw *et al.* 2005; Weiss *et al.* 2006) (Fig. 1*G*). In our previous study (Shiferaw *et al.* 2005), we controlled  $Ca_i^{2+} \rightarrow V_m$  coupling with a varying relative contribution of  $I_{CaL}$  and NCX by changing the  $Ca^{2+}$ -induced inactivation strength ( $\gamma$ ). As  $\gamma$  is increased,  $I_{CaL}$  dominates and  $Ca_i^{2+} \rightarrow V_m$  coupling becomes more negative. The  $Ca_i^{2+} \rightarrow V_m$  coupling is positive when  $\gamma$  is 0.7. By fixing  $\gamma = 0.7$  and varying  $Ca^{2+}$ -sensitive K<sup>+</sup> currents, we demonstrate that  $Ca^{2+}$ -sensitive K<sup>+</sup> currents can change the  $Ca_i^{2+} \rightarrow V_m$  coupling.

 $V_{\rm m}$  and  ${\rm Ca}_{\rm i}^{2+}$  alternans can be electromechanically concordant (a Long–Short–Long–Short APD sequence corresponding to a Large–Small–Large–Small  ${\rm Ca}^{2+}$  transient sequence) or discordant (a Long–Short–Long–Short APD sequence corresponding to a Small–Large–Small–Large  ${\rm Ca}^{2+}$  transient sequence) (Fig. 1*H*). These phenomena depend on the underlying instability mechanisms ( $V_{\rm m}$ -driven or Ca<sub>i</sub><sup>2+</sup>-driven) and the coupling between  $V_{\rm m}$  and Ca<sub>i</sub><sup>2+</sup> cycling.

### Results

 $I_{\rm SK}$  is an outward current during the AP. Introduction of the SK channel, while keeping all other parameters constant as in Shiferaw *et al.* (2005) was shown to shorten the APD (Fig. 1*F*) similar to other outward currents.

# Introduction of $I_{SK}$ increases the area of stable APs with three distinct modes of oscillations at the stability boundary

By varying the instability factors of  $V_{\rm m}$  ( $\tau_{\rm f}$ ) and Ca<sup>2+</sup><sub>i</sub> cycling (*u*), we plotted the stability diagram (Fig. 2A and B) for the pacing cycle length (PCL) of 300 ms. Without  $I_{SK}$ (Fig. 2A), the Ca<sub>i</sub><sup>2+</sup> $\rightarrow$  V<sub>m</sub> coupling is positive and alternans was always electromechanically concordant regardless of the instability mechanism. When ISK was introduced  $(g_{sk} = 4 \ \mu S \ \mu F^{-1}, EC_{50} = 0.7 \ \mu M)$ , the area of the stable APs (i.e. periodic APs) was increased, evident from Fig. 2A and B. In addition, three distinct modes of oscillations, electromechanically concordant alternans, quasiperiodic oscillations and electromechanically discordant alternans, occurred at the stability boundary, as labelled in Fig. 2B (as C, D, E). The relation between peak  $[Ca^{2+}]_i$  and APD was plotted, with (C) corresponding to electromechanically concordant alternans, (D) representing electromechanically discordant alternans as seen by the negative relation between peak  $[Ca^{2+}]_i$  and APD, while (E) shows the quasiperiodic oscillation with corresponding orbit in peak  $[Ca^{2+}]_i$ -APD plane (Fig. 2*E* right panel). From our previous study (Shiferaw et al. 2005) three modes of oscillations implies that the  $Ca_i^{2+} \rightarrow V_m$  coupling is negative.

### Affinity of $[Ca^{2+}]$ also affects $V_m$ - $Ca_i^{2+}$ dynamics

Figure 3*A* shows how the stability boundary curves (at PCL = 300 ms) shift with increasing  $I_{SK}$  conductance  $(g_{sk})$ . Figure 3*B* shows how these curves shift as the  $I_{SK}$   $[Ca^{2+}]_i$  dependence (EC<sub>50</sub>) is altered from 0.1 to 1.0  $\mu$ M. When Ca<sup>2+</sup> affinity is high (lower EC<sub>50</sub>),  $I_{SK}$  shortens both short AP and long AP regardless of the amplitude of the Ca<sup>2+</sup> transient. However, when Ca<sup>2+</sup> affinity becomes lower (higher EC<sub>50</sub>),  $I_{SK}$  shortens only when the amplitude of the Ca<sup>2+</sup> transient is large. This means that the change in the APD becomes larger even when the change in the amplitude of the Ca<sup>2+</sup> transient is the same. This promotes negative Ca<sup>2+</sup><sub>i</sub>  $\rightarrow$  V<sub>m</sub> coupling ( $\Delta$ APD *vs*.  $\Delta$ peak [Ca<sup>2+</sup>]<sub>i</sub> will become steeper). To test this idea of coupling change, we plotted  $\triangle APD$  vs. peak  $[Ca^{2+}]_i$  (Fig. 3*C*) for small changes in  $[Ca^{2+}]_i$ . Peak  $[Ca^{2+}]_i$  was varied by changing initial (diastolic) SR  $Ca^{2+}$  load. Without  $I_{SK}$  the positive slope indicates positive  $Ca_i^{2+} \rightarrow V_m$  coupling, but as  $g_{sk}$  increases the slope flattens and by  $g_{sk} = 4 \ \mu S \ \mu F^{-1}$ , the  $Ca_i^{2+} \rightarrow V_m$  coupling becomes substantially negative (Fig. 3*C*). The sign was changed around  $g_{sk} = 1 \ \mu S \ \mu F^{-1}$  (Fig. 3*D*). Higher  $Ca^{2+}$  affinity also makes the Ca<sup>2+</sup><sub>i</sub> $\rightarrow$   $V_{\rm m}$  coupling more negative (Fig. 3*E* and *F*).

 $I_{\rm Ks}$  is also Ca<sup>2+</sup> sensitive. As expected, qualitatively similar results are seen with increasing  $I_{\rm Ks}$  as were seen with  $I_{\rm SK}$ . When the maximum conductance of  $I_{\rm Ks}$  ( $g_{\rm ks}$ ) is reduced by half, we observed electromechanically concordant alternans at the stability boundaries (Fig. 4*A*). On the other hand, when  $g_{\rm ks}$  is



### Figure 2. Effects of I<sub>SK</sub> at the cellular level

Stability boundaries were numerically determined for both the baseline system and the baseline plus SK, as seen in *A* and *B*, respectively. *A* demonstrates one mode of instability, namely concordant alternans, while *B* shows three distinct modes of instability; concordant alternans (*C*), discordant alternans (*D*), and quasiperiodic oscillation (*E*).



### Figure 3. Effects of the maximum conductance and $Ca^{2+}$ affinity of $I_{SK}$

A, stability boundaries plotted for three  $g_{sk}$ , with values of 0, 2.0 and 4.0  $\mu$ S  $\mu$ F<sup>-1</sup>. B, stability boundaries plotted for three EC<sub>50</sub> values of 1.0, 0.5 and 0.1  $\mu$ m corresponding to the black, red and green curves, respectively. C, the slope of  $\Delta$ APD vs.  $\Delta$ [Ca<sup>2+</sup>]<sub>peak</sub> indicates the Ca<sup>2+</sup><sub>i</sub> $\rightarrow$ V<sub>m</sub> coupling. When  $g_{sk} = 0 \ \mu$ S  $\mu$ F<sup>-1</sup>, the Ca<sup>2+</sup><sub>i</sub> $\rightarrow$ V<sub>m</sub> coupling is positive, while when  $g_{sk} = 4.0 \ \mu$ S  $\mu$ F<sup>-1</sup>, the Ca<sup>2+</sup><sub>i</sub> $\rightarrow$ V<sub>m</sub> coupling is negative. EC<sub>50</sub> is 0.7  $\mu$ M. D, slope ( $\Delta$ APD/ $\Delta$ [Ca<sup>2+</sup>]<sub>peak</sub>) vs.  $g_{sk}$ . E,  $\Delta$ APD vs.  $\Delta$ [Ca<sup>2+</sup>]<sub>peak</sub> when EC<sub>50</sub> is varied.  $g_{sk}$  is 4.0  $\mu$ S  $\mu$ F<sup>-1</sup>. F, slope ( $\Delta$ APD/ $\Delta$ [Ca<sup>2+</sup>]<sub>peak</sub>) vs. EC<sub>50</sub>.



### Figure 4. Effects of $I_{Ks}$ at the cellular level

*A*, stability diagram when  $g_{ks}$  is small (50% of the original value, the original  $g_{ks}$  is 0.0245 mS  $\mu$ F<sup>-1</sup>). Alternans is always electromechanically concordant. *B*, stability diagram when  $g_{ks}$  is large (300% of the original value). In this case, there are three distinct modes of instability; electromechanically concordant alternans (*C*), electromechanically discordant alternans (*D*), and quasiperiodic oscillation (*E*).

increased to 300%, we observed three modes of oscillations (Fig. 4*B*). These modes are plotted in Fig. 4*C* (electromechanically concordant alternans), Fig. 4*D* (electromechanically discordant alternans), and Fig. 4*E* (quasiperiodic oscillations).

# Both the maximum conductance $(g_{ks})$ and Ca<sup>2+</sup> sensitivity affect the stability boundaries and the modes of oscillations

When  $g_{ks}$  was increased from 50 to 300%, it not only increased the stable area but also induced three modes (Fig. 5*A*). On the other hand, when Ca<sup>2+</sup> sensitivity was



### Figure 5. Effects of the maximum conductance and $Ca^{2+}$ affinity of $I_{Ks}$

A, stability boundaries plotted for multiple  $g_{ks}$ , with values of 50, 100, 200, 250 and 300% of the original value (0.0245 mS  $\mu$ F<sup>-1</sup>). B, stability boundaries plotted for three  $K_m$ , with values of 1.0, 0.5 and 2.0  $\mu$ M corresponding to the black, red and green curves, respectively. C,  $\Delta$ APD vs.  $\Delta$ [Ca<sup>2+</sup>]<sub>peak</sub> when  $g_{ks}$  is varied. D, slope ( $\Delta$ APD/ $\Delta$ [Ca<sup>2+</sup>]<sub>peak</sub>) vs.  $g_{ks}$ . E,  $\Delta$ APD vs.  $\Delta$ [Ca<sup>2+</sup>]<sub>peak</sub> when  $K_m$  is varied. F, slope ( $\Delta$ APD/ $\Delta$ [Ca<sup>2+</sup>]<sub>peak</sub>) vs.  $K_m$ .

decreased, it suppressed electromechanically concordant and discordant alternans but promoted quasiperiodic oscillations (Fig. 5*B*). This indicates that Ca<sup>2+</sup> sensitivity changed only the coupling without changing  $V_{\rm m}$  and Ca<sup>2+</sup><sub>i</sub> instabilities. Figure 5*C* and *D* shows positive Ca<sup>2+</sup><sub>i</sub>  $\rightarrow V_{\rm m}$ coupling when  $I_{\rm Ks}$  is small ( $g_{\rm ks} \times 0.5$ ) and negative Ca<sup>2+</sup><sub>i</sub>  $\rightarrow V_{\rm m}$  coupling when  $I_{\rm Ks}$  is large ( $g_{\rm ks} \times 3$ ).

From these single cell simulations, we summarize as follows. If alternans is  $Ca_i^{2+}$ -driven (small  $\tau_f$  and large u, along the abscissa in Figs 2–4), increasing the maximum conductance of  $I_{SK}$  or  $I_{Ks}$  promotes electromechanically discordant alternans (Fig. 6A). On the other hand, if alternans is  $V_m$ -driven (large  $\tau_f$  and small u, along ordinate in Figs 2–4), electromechanically concordant alternans remains electromechanically concordant even when the maximum conductance of  $I_{SK}$  or  $I_{Ks}$  is increased (Fig. 6B).

## At the tissue level, increasing *I*<sub>SK</sub> or *I*<sub>Ks</sub> leads to different types of spatially discordant alternans

In tissue, cellular level instability mechanisms lead to different alternans. We paced the left-most five cells of the 6 cm (400 cell) homogeneous cable. First, we paced the cable at a PCL of 600 ms until it reached the steady state. At this PCL, there is no alternans. Then, the PCL was decreased to 300 ms. Alternans gradually developed. When all cells in the cable reached the steady state, we plotted APD and peak  $[Ca^{2+}]_i$  along the cable (Fig. 7).

When alternans are  $Ca_i^{2+}$ -driven (small  $\tau_f$  and large u), if these currents are small, the  $Ca_i^{2+} \rightarrow V_m$  coupling is positive and the mechanism of spatially discordant alternans is due to competition between synchronization due to diffusive electrical coupling and desynchronization due to Ca<sup>2+</sup>-related stochasticity (Sato et al. 2013). The mechanism of spatially discordant alternans does not depend on the details of the ionic currents. This occurs whenever the cellular level instability mechanism is  $Ca_i^{2+}$ -driven and the  $Ca_i^{2+} \rightarrow V_m$  coupling is positive. In this case, the spatial scale of phase reversal of  $Ca_i^{2+}$ alternans is short (Sato et al. 2007) (Fig. 7A and D), where spatially discordant alternans is shown. However, when  $I_{\rm SK}$  or  $I_{\rm Ks}$  becomes large, the  ${\rm Ca}_{\rm i}^{2+} \rightarrow V_{\rm m}$  coupling becomes negative and the mechanism of spatially discordant alternans is due to Turing-type instability (instability due to electrotonic coupling) (Sato et al. 2006) (Fig. 7B and E). The mechanism of this spatially discordant alternans is also model independent and requires only  $Ca_i^{2+}$ -driven instability and negative  $Ca_i^{2+} \rightarrow V_m$  coupling. If alternans is  $V_{\rm m}$ -driven, the mechanism of spatially discordant alternans is due to interaction between APD and conduction velocity restitution (Echebarria & Karma, 2002, 2007)(Fig. 7C and F). In this case, the spatial scales



### **Figure 6. Summary of the effects of Ca<sup>2+</sup>-sensitive K<sup>+</sup> currents** *A*, if alternans is Ca<sup>2+</sup>-driven, Ca<sup>2+</sup>-sensitive K<sup>+</sup>

A, if alternans is  $Ca_{1}^{2}$  -driven,  $Ca_{2}^{2}$  -sensitive K<sup>2</sup> currents promote electromechanically discordant alternans. *B*, if alternans is  $V_{m}$ -driven, electromechanically concordant alternans remains electromechanically concordant even when  $Ca_{2}^{2+}$ -sensitive K<sup>+</sup> currents are increased.

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## Figure 7. Effects of $I_{SK}$ and $I_{Ks}$ at the tissue level

A,  $Ca^{2+}$ -driven alternans without  $I_{SK}$ . The mechanism of spatially discordant alternans is competition between synchronization due to diffusive coupling and desynchronization due to stochasticity. B,  $Ca^{2+}$ -driven alternans with I<sub>SK</sub>. The mechanism of spatially discordant alternans is Turing-type instability. C, V<sub>m</sub>-driven alternans. The mechanism of spatially discordant alternans is interaction between APD and conduction velocity restitution. When alternans is V<sub>m</sub>-driven, changing the magnitude of ISK does not change the mechanism of spatially discordant alternans. In this simulation,  $g_{sk}$  is 4.0  $\mu$ S  $\mu$ F<sup>-1</sup>. *D*, Ca<sup>2+</sup>-driven alternans when  $g_{\rm ks}$  is small (50% of the original value). The mechanism of spatially discordant alternans is competition between synchronization due to diffusive coupling and desynchronization due to stochasticity. E, Ca<sup>2+</sup>-driven alternans when  $g_{\rm ks}$  is large (300% of the original value). The mechanism of spatially discordant alternans is Turing-type instability. F, V<sub>m</sub>-driven alternans. The mechanism of spatially discordant alternans is interaction between APD and conduction velocity restitution. When alternans is V<sub>m</sub>-driven, changing the magnitude of  $I_{\rm Ks}$  does not change the mechanism of spatially discordant alternans. In this simulation,  $g_{\rm ks}$  is 300% of the original value.

of phase reversal of  $Ca_i^{2+}$  alternans is large (e.g. *vs.* that in Fig. 7*A* and *D*) (Sato *et al.* 2007).

### Discussion

In this study, we have shown that  $Ca^{2+}$ -sensitive  $K^+$  currents  $I_{Ks}$  and  $I_{SK}$  promote negative  $Ca_i^{2+} \rightarrow V_m$  coupling, which creates three modes of instability at the cellular level and Turing-type instability at the tissue level.

In 1968, Nolasco and Dahlen used APD restitution, which is the relationship between APD and the previous diastolic interval (DI), APD(n + 1) = Function (F) (DI(*n*)), to demonstrate that the formation of alternans occurs when the slope of the APD restitution curve exceeds unity (Nolasco & Dahlen, 1968). This interpretation provides a model for the relationship of  $V_m$  and APD stability. However, this one-dimensional map cannot explain the existence of three distinct modes (electromechanically concordant/discordant alternans and quasiperiodicity) of instability (Shiferaw *et al.* 2005), which have been shown experimentally (Rubenstein & Lipsius, 1995; Gilmour *et al.* 1997; Walker & Rosenbaum, 2003).

One possible mechanism for these multiple modes is the interactions between  $V_{\rm m}$  and  ${\rm Ca_i^{2+}}$  cycling.  ${\rm Ca_i^{2+}}$  cycling can be unstable when the myocyte is  ${\rm Ca^{2+}}$  overloaded or RyRs are sensitized.  ${\rm Ca_i^{2+}}$  cycling can also be unstable when the cell is rapidly paced. In fact, Chudin *et al.* have demonstrated that  ${\rm Ca_i^{2+}}$  transients exhibit alternans even with AP clamp waveform (i.e. APs are periodic) (Chudin *et al.* 1999). This implies that  ${\rm Ca_i^{2+}}$  cycling has its own non-linear dynamics (Dilly & Lab, 1988; Hall *et al.* 1999; Hall & Gauthier, 2002; Fox *et al.* 2002*a*; Pruvot *et al.* 2004; Picht *et al.* 2006; Wang *et al.* 2014).

In the present study, we used a computational model which shows both non-linearities of  $V_{\rm m}$  and  $Ca_{\rm i}^{2+}$ cycling. These two non-linear systems are coupled via Ca<sup>2+</sup>-sensitive currents. As the myocyte experiences a large Ca<sup>2+</sup> transient, the open probability of the Ca<sup>2+</sup>-sensitive K<sup>+</sup> channel will increase, increasing outward K<sup>+</sup> current. This larger Ca<sup>2+</sup> transient also promotes Ca<sup>2+</sup>-dependent inactivation of L-type Ca2+ channels, limiting inward  $Ca^{2+}$  current, so both K<sup>+</sup> and  $Ca^{2+}$  current effects tend to promote negative  $Ca_i^{2+} \rightarrow V_m$  coupling. However, Ca<sup>2+</sup>-dependence increases in inward current via NCX (due to changes in electrochemical driving force) promoting positive  $Ca_i^{2+} \rightarrow V_m$  coupling. Net changes in the competition between these Ca2+-dependent currents produces the transition from positive to negative  $Ca_i^{2+} \rightarrow V_m$  coupling. Any increase in  $Ca^{2+}$ -dependent K<sup>+</sup> current  $(I_{Ks} \text{ or } I_{SK})$  would tend to shift the coupling negative. Moreover, increasing either  $I_{Ks}$  or  $I_{SK}$  reveals three modes of instability. As the  $Ca_i^{2+} \rightarrow V_m$  coupling becomes more negative (with rising  $I_{Ks}$  or  $I_{SK}$ ), the slope of  $\triangle$ APD vs.  $\triangle$ Ca<sup>2+</sup> is negative, and three distinct modes of alternans are induced: (1)  $V_{\rm m}$ -driven electromechanically concordant alternans (large  $\tau_{\rm f}$ , small u), (2)  ${\rm Ca_i^{2+}}$ -driven electromechanically discordant alternans (small  $\tau_{\rm f}$ , large u), and (3) quasiperiodic oscillation (large  $\tau_{\rm f}$ , large u)). All three of these modes of instability have been observed in both voltage and Ca<sup>2+</sup> recordings (Dilly & Lab, 1988; Hall *et al.* 1999; Hall & Gauthier, 2002; Fox *et al.* 2002*a*; Pruvot *et al.* 2004).

Another important point of this study is that we introduced a novel model of the SK channel. Using this model, we demonstrate that its  $Ca^{2+}$  dependence (Hirschberg *et al.* 1998) is responsible for the observed existence of three distinct modes of instability.

Typical healthy myocytes show electromechanically concordant alternans during fast pacing. We found that as the maximum conductance of  $I_{SK}$  was increased, electromechanically concordant alternans became electromechanically discordant when alternans is  $Ca_i^{2+}$ -driven. These findings shed light on the underlying mechanisms of cardiac alternans, especially for failing hearts since  $I_{SK}$ was shown to be up-regulated in ventricular myocytes in heart failure (Yu et al. 2015). In this study, we used a ventricular AP model. Alternans have also been observed in atrial cells (Kanaporis & Blatter, 2015). We expect  $I_{SK}$ to have the same dynamical effects on alternans in atrial cells, and may be even more impactful there because of higher basal density of ISK in atrial vs. ventricular myocytes (Xu et al. 2003). Finally, our study also provides insights into the non-linearities of cardiac tissue behaviour and a potential link between molecular processes within the cell to the development of disorders of the organ itself.

### References

- Chang P-C & Chen P-S (2015). SK channels and ventricular arrhythmias in heart failure. *Trends Cardiovasc Med* **25**, 508–514.
- Chang P-C, Hsieh Y-C, Hsueh C-H, Weiss JN, Lin S-F & Chen P-S (2013*a*). Apamin induces early afterdepolarizations and torsades de pointes ventricular arrhythmia from failing rabbit ventricles exhibiting secondary rises in intracellular calcium. *Heart Rhythm* **10**, 1516–1524.
- Chang PC, Turker I, Lopshire JC, Masroor S, Nguyen BL, Tao W, Rubart M, Chen PS, Chen Z & Ai T (2013b).
  Heterogeneous upregulation of apamin-sensitive potassium currents in failing human ventricles. *J Am Heart Assoc* 2, e004713.
- Chudin E, Goldhaber J, Garfinkel A, Weiss J & Kogan B (1999). Intracellular Ca<sup>2+</sup> dynamics and the stability of ventricular tachycardia. *Biophys J* **77**, 2930–2941.
- Dilly SG & Lab MJ (1988). Electrophysiological alternans and restitution during acute regional ischaemia in myocardium of anaesthetized pig. *J Physiol* **402**, 315–333.
- Echebarria B & Karma A (2002). Instability and spatiotemporal dynamics of alternans in paced cardiac tissue. *Phys Rev Lett* **88**, 208101.

- Echebarria B & Karma A (2007). Amplitude equation approach to spatiotemporal dynamics of cardiac alternans. *Phys Rev E Stat Nonlin Soft Matter Phys* **76**, 051911.
- Fox JJ, Bodenschatz E & Gilmour RF Jr (2002*a*). Period-doubling instability and memory in cardiac tissue. *Phys Rev Lett* **89**, 138101.
- Fox JJ, McHarg JL & Gilmour RF Jr (2002*b*). Ionic mechanism of electrical alternans. *Am J Physiol Heart Circ Physiol* **282**, H516–H530.
- Garfinkel A, Kim YH, Voroshilovsky O, Qu Z, Kil JR, Lee MH, Karagueuzian HS, Weiss JN & Chen PS (2000). Preventing ventricular fibrillation by flattening cardiac restitution. *Proc Natl Acad Sci USA* **97**, 6061–6066.
- Gilmour RF, Otani NF & Watanabe MA (1997). Memory and complex dynamics in cardiac Purkinje fibers. *Am J Physiol Heart Circ Physiol* **272**, H1826–H1832.
- Groenendaal W, Ortega FA, Krogh-Madsen T & Christini DJ (2014). Voltage and calcium dynamics both underlie cellular alternans in cardiac myocytes. *Biophys J* **106**, 2222–2232.
- Hall GM, Bahar S & Gauthier DJ (1999). Prevalence of rate-dependent behaviors in cardiac muscle. *Phys Rev Lett* **82**, 2995–2998.
- Hall GM & Gauthier DJ (2002). Experimental control of cardiac muscle alternans. *Phys Rev Lett* **88**, 198102.
- Hayashi H, Shiferaw Y, Sato D, Nihei M, Lin S-F, Chen P-S, Garfinkel A, Weiss JN & Qu Z (2007). Dynamic origin of spatially discordant alternans in cardiac tissue. *Biophys J* 92, 448–460.
- Hirschberg B, Maylie J, Adelman JP & Marrion NV (1998). Gating of recombinant small-conductance Ca-activated K<sup>+</sup> channels by calcium. *J Gen Physiol* **111**, 565–581.
- Hongyuan B, Xin D, Jingwen Z, Li G & Yajuan N (2016). Apamin-sensitive small conductance calcium-activated potassium channels were negatively regulated by captopril in volume-overload heart failure rats. *J Membr Biol* **249**, 429–436.
- Hsieh YC, Chang PC, Hsueh CH, Lee YS, Shen C, Weiss JN, Chen Z, Ai T, Lin SF & Chen PS (2013). Apamin-sensitive potassium current modulates action potential duration restitution and arrhythmogenesis of failing rabbit ventricles. *Circ Arrhythm Electrophysiol* **6**, 410–418.
- Hsueh C-H, Chang P-C, Hsieh Y-C, Reher T, Chen P-S & Lin S-F (2013). Proarrhythmic effect of blocking the small conductance calcium activated potassium channel in isolated canine left atrium. *Heart Rhythm* **10**, 891–898.
- Kanaporis G & Blatter LA (2015). The mechanisms of calcium cycling and action potential dynamics in cardiac alternans. *Circ Res* **116**, 846–856.
- Laurita KR & Rosenbaum DS (2008). Cellular mechanisms of arrhythmogenic cardiac alternans. *Prog Biophys Mol Biol* **97**, 332–347.
- Li N, Timofeyev V, Tuteja D, Xu D, Lu L, Zhang Q, Zhang Z, Singapuri A, Albert TR, Rajagopal AV, Bond CT, Periasamy M, Adelman J & Chiamvimonvat N (2009). Ablation of a Ca<sup>2+</sup>-activated K<sup>+</sup> channel (SK2 channel) results in action potential prolongation in atrial myocytes and atrial fibrillation. *J Physiol* **587**, 1087–1100.

- Lu L, Zhang Q, Timofeyev V, Zhang Z, Young JN, Shin H-S, Knowlton AA & Chiamvimonvat N (2007). Molecular coupling of a Ca<sup>2+</sup>-activated K<sup>+</sup> channel to L-type Ca<sup>2+</sup> channels via  $\alpha$ -actinin2. *Circ Res* **100**, 112–120.
- Mahajan A, Shiferaw Y, Sato D, Baher A, Olcese R, Xie LH, Yang MJ, Chen PS, Restrepo JG, Karma A, Garfinkel A, Qu Z & Weiss JN (2008). A rabbit ventricular action potential model replicating cardiac dynamics at rapid heart rates. *Biophys J* 94, 392–410.
- Merchant FM & Armoundas AA (2012). Role of substrate and triggers in the genesis of cardiac alternans, from the myocyte to the whole heart: implications for therapy. *Circulation* **125**, 539–549.
- Nolasco JB & Dahlen RW (1968). A graphic method for the study of alternation in cardiac action potentials. *J Appl Physiol* **25**, 191–196.
- Pastore JM, Girouard SD, Laurita KR, Akar FG & Rosenbaum DS (1999). Mechanism linking T-wave alternans to the genesis of cardiac fibrillation. *Circulation* **99**, 1385–1394.
- Picht E, DeSantiago J, Blatter LA & Bers DM (2006). Cardiac alternans do not rely on diastolic sarcoplasmic reticulum calcium content fluctuations. *Circ Res* **99**, 740–748.
- Pruvot EJ, Katra RP, Rosenbaum DS & Laurita KR (2004). Role of calcium cycling versus restitution in the mechanism of repolarization alternans. *Circ Res* **94**, 1083–1090.
- Qu Z & Garfinkel A (1999). An advanced algorithm for solving partial differential equation in cardiac conduction. *IEEE Trans Biomed Eng* **46**, 1166–1168.
- Rubenstein DS & Lipsius SL (1995). Premature beats elicit a phase reversal of mechanoelectrical alternans in cat ventricular myocytes: a possible mechanism for reentrant arrhythmias. *Circulation* **91**, 201–214.
- Sato D, Bers DM & Shiferaw Y (2013). Formation of spatially discordant alternans due to fluctuations and diffusion of calcium. *PLoS One* **8**, e85365.
- Sato D & Clancy CE (2013). Cardiac electrophysiological dynamics from the cellular level to the organ level. *Biomed Eng Comput Biol* **5**, 69–75.
- Sato D, Shiferaw Y, Garfinkel A, Weiss JN, Qu Z & Karma A (2006). Spatially discordant alternans in cardiac tissue: role of calcium cycling. *Circ Res* **99**, 520–527.
- Sato D, Shiferaw Y, Qu Z, Garfinkel A, Weiss JN & Karma A (2007). Inferring the cellular origin of voltage and calcium alternans from the spatial scales of phase reversal during discordant alternans. *Biophys J* **92**, L33–L35.
- Shiferaw Y, Sato D & Karma A (2005). Coupled dynamics of voltage and calcium in paced cardiac cells. *Phys Rev E Stat Nonlin Soft Matter Phys* **71**, 021903.
- Shiferaw Y, Watanabe MA, Garfinkel A, Weiss JN & Karma A (2003). Model of intracellular calcium cycling in ventricular myocytes. *Biophys J* **85**, 3666–3686.
- Tuteja D, Xu D, Timofeyev V, Lu L, Sharma D, Zhang Z, Xu Y, Nie L, Vazquez AE, Young JN, Glatter KA & Chiamvimonvat N (2005). Differential expression of small-conductance Ca<sup>2+</sup>-activated K<sup>+</sup> channels SK1, SK2, and SK3 in mouse atrial and ventricular myocytes. *Am J Physiol Heart Circ Physiol* 289, H2714–H2723.

- Valdivia HH (2015). Mechanisms of cardiac alternans in atrial cells: intracellular Ca<sup>2+</sup> disturbances lead the way. *Circ Res* **116**, 778–780.
- Walker ML & Rosenbaum DS (2003). Repolarization alternans: implications for the mechanism and prevention of sudden cardiac death. *Cardiovasc Res* 57, 599–614.
- Wang L, Myles RC, De Jesus NM, Ohlendorf AK, Bers DM & Ripplinger CM (2014). Optical mapping of sarcoplasmic reticulum Ca<sup>2+</sup> in the intact heart: ryanodine receptor refractoriness during alternans and fibrillation. *Circ Res* **114**, 1410–1421.
- Weiss JN, Karma A, Shiferaw Y, Chen P-S, Garfinkel A & Qu Z (2006). From pulsus to pulseless: the saga of cardiac alternans. *Circ Res* **98**, 1244–1253.
- Weiss JN, Nivala M, Garfinkel A & Qu Z (2011). Alternans and arrhythmias: from cell to heart. *Circ Res* **108**, 98–112.
- Wilson LD, Wan X & Rosenbaum DS (2006). Cellular alternans. Ann N Y Acad Sci 1080, 216–234.
- Xie F, Qu Z, Yang J, Baher A, Weiss JN & Garfinkel A (2004). A simulation study of the effects of cardiac anatomy in ventricular fibrillation. J Clin Invest 113, 686–693.
- Xu Y, Dong PH, Zhang Z, Ahmmed GU & Chiamvimonvat N (2002). Presence of a calcium-activated chloride current in mouse ventricular myocytes. *Am J Physiol Heart Circ Physiol* 283, H302–H314.
- Xu Y, Tuteja D, Zhang Z, Xu D, Zhang Y, Rodriguez J, Nie L, Tuxson HR, Young JN, Glatter KA, Vázquez AE, Yamoah EN & Chiamvimonvat N (2003). Molecular identification and functional roles of a Ca<sup>2+</sup>-activated K<sup>+</sup> channel in human and mouse hearts. J Biol Chem 278, 49085–49094.
- Yu C-C, Corr C, Shen C, Shelton R, Yadava M, Rhea IB, Straka S, Fishbein MC, Chen Z, Lin S-F, Lopshire JC & Chen P-S (2015). Small conductance calcium-activated potassium current is important in transmural repolarization of failing human ventricles. *Circulation* 8, 667–676.

- Zhang Q, Timofeyev V, Lu L, Li N, Singapuri A, Long MK, Bond CT, Adelman JP & Chiamvimonvat N (2008). Functional roles of a Ca<sup>2+</sup>-activated K<sup>+</sup> channel in atrioventricular nodes. *Circ Res* **102**, 465–471.
- Zhang XD, Lieu DK & Chiamvimonvat N (2015). Small-conductance Ca<sup>2+</sup>-activated K<sup>+</sup> channels and cardiac arrhythmias. *Heart Rhythm* **12**, 1845–1851.

### **Additional information**

### **Competing interests**

None declared.

### **Author contributions**

All authors contributed ideas and discussion. M.K. and D.S. performed computer simulations and mathematical analysis. All authors wrote the manuscript, approved the final version of the manuscript and agree to be accountable for all aspects of the work. All persons designated as authors qualify for authorship, and all those who qualify for authorship are listed.

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### Translational perspective

Recent experimental studies showed that  $I_{SK}$  becomes extremely large in failing hearts. Thus, understanding the role of the SK channel in alternans dynamics is potentially important to develop new drugs and therapies for heart failure. In this study, we investigated the role of Ca<sup>2+</sup>-sensitive K<sup>+</sup> channels ( $I_{SK}$  and  $I_{KS}$ ) on  $V_m$  and Ca<sup>2+</sup> dynamics. An increase of Ca<sup>2+</sup>-sensitive K<sup>+</sup> currents can be responsible for electromechanically discordant alternans and quasiperiodic oscillations at the cellular level and Turing-type spatially discordant alternans in tissue. These results provide theoretical bases to understand and interpret experimental and clinical results.

### **Supporting information**

The following supporting information is available in the online version of this article.

Data S1: Details of the model.