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Additional Information

# Title:

MULTISCALE COMPUTATIONAL ANALYSIS OF THE BIOELECTRIC

CONSEQUENCES OF MYOCARDIAL ISCHAEMIA AND INFARCTION

# Authors:

Jose M. Ferrero<sup>1</sup>, Beatriz Trenor<sup>1</sup>, Lucia Romero<sup>1</sup>

# Institution:

<sup>1</sup> I3BH, Universitat Politècnica de València

# Address:

<sup>1</sup> Instituto I3BH, Universitat Politècnica de València, Camino de Vera s/n, 46022

Valencia, Spain

# Corresponding author:

Jose M. Ferrero

Universitat Politècnica de València - Instituto I3BH

Camino de Vera s/n,

46022 Valencia, Spain.

Phone number: +34-96-3877007 (ext. 67037).

E-mail: cferrero@gbio.i3bh.es

# Abstract

Ischaemic heart disease is considered as the single most frequent cause of death, provoking more than 7,000,000 deaths every year worldwide. A high percentage of patients experience sudden cardiac death, caused in most cases by tachyarrhythmic mechanisms associated to myocardial ischaemia and infarction. These diseases are difficult to study using solely experimental means due to their complex dynamics and unstable nature. In the past decades, integrative computational simulation techniques have become a powerful tool to complement experimental and clinical research when trying to elucidate the intimate mechanisms of ischaemic electrophysiological processes and to aid the clinician in the improvement and optimization of therapeutic procedures. The purpose of this paper is to briefly review some of the multiscale computational models of myocardial ischaemia and infarction developed in the past twenty years, ranging from the cellular level to whole-heart simulations.

# Keywords

ischaemia; infarction; computer simulations; mathematical models; reentrant arrhythmias

## INTRODUCTION

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### Ischaemia and infarction

Ischaemic heart disease is considered as the single most frequent cause of death, provoking more than 7,000,000 deaths every year worldwide.<sup>1,2</sup> A high percentage of patients suffering ischaemic heart disease experience sudden cardiac death,<sup>3</sup> with over to 450,000 cases being reported in the U.S. annually.<sup>4</sup> Almost 70% of them were probably caused by tachyarrhythmias associated to myocardial ischaemia.<sup>4,5</sup> It is therefore not surprising that an enormous body of research is being devoted to investigate the mechanisms underlying the relationship between myocardial ischaemia/infarction and arrhythmias.

10 Myocardial ischaemia usually results from the occlusion of a coronary artery, and can be defined as a condition in which the blood supply to heart cells is insufficient to meet their metabolic demands.<sup>6</sup> During the first 15 minutes after coronary artery occlusion ("phase 1A ischaemia"), the heart suffers profound metabolic and electrophysiological changes at different scales. At the subcellular level, electrolyte concentrations change, ATP and oxygen levels decline and pH

decreases.<sup>7</sup> At the cellular level, ion channel activity changes, resting potential becomes less negative, action potential duration (APD) shortens, upstroke velocity decreases and cells loose excitability.<sup>7</sup> At the organ level, conduction velocity (CV) decreases and severe tachyarrhythmias may easily develop.<sup>8,9</sup> During the period that follows ("phase 1B ischaemia", 15-45 minutes post occlusion), cellular uncoupling develops,<sup>10</sup> ischaemic tissue becomes inexcitable and arrhythmias may re-appear

20 after a safe period of several minutes.<sup>11,12</sup>

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When the acute phase terminates, the infarcted tissue begins to heal<sup>13</sup> (subacute phase of myocardial infarction, MI) and spontaneous ventricular arrhythmias can take place in this period.<sup>14,15</sup> Finally, complete healing and scar formation occurs after several days (or weeks). In this chronic phase of MI, reentrant ventricular tachycardias (VTs) are still inducible, indicating that the

25 arrhythmogenic substrate is still present, albeit the mechanisms of these chronic-phase arrhythmias are different from those of the acute phase.

# Simulation of ischaemia and infarction

In the past decades, integrative computational simulation has become a powerful tool to complement experimental and clinical research when trying to elucidate the intimate mechanisms of ischaemic electrophysiological processes.<sup>16-22</sup> The heart is a particularly appropriate organ to be

computationally simulated on a multiscale basis because of the long history of cardiac cell modelling<sup>23</sup> and the continuous interaction between experiments and simulation. From the earliest Luo-Rudy models for guinea-pig ventricular cells<sup>24</sup> to the most recent electrophysiological model of human ventricular myocytes,<sup>25</sup> it has become possible to dynamically compute ionic currents through

- 5 sarcolemmal channels and transporters, ion concentrations (including Ca<sup>2+</sup> levels in the different subcellular compartments) and APs with great degree of electrophysiological detail. In parallel, medical imaging techniques have enabled us to reconstruct heart anatomy and structure "in silico", allowing multiscale computational simulations in which genetic defects, for instance, can be linked to the whole organ behaviour. These "virtual hearts" are today a perfect example of how an integrative
- 10 biology approach may aid in the understanding of cardiac arrhythmias and in the improvement of therapeutic techniques such as drug administration, electrical defibrillation or radio-frequency ablation.

Acute myocardial ischaemia and MI are among the most successfully simulated cardiac pathologies.<sup>17</sup> Experimental understanding of the intimate mechanisms of acute ischaemia is particularly difficult due to the complex dynamics and unstable nature of the phenomenon, and the fact

- 15 that most lethal arrhythmias occur before hospital admission makes it almost impossible to carry out systematic clinical studies. Also, the potential immediacy of death associated to ischaemic arrhythmias poses insurmountable ethical and practical obstacles. Therefore, computer simulations are of special importance. In the subacute and chronic stages of MI, simulations are also of great interest to aid the clinician during ablation interventions. This therapeutic procedure has unsatisfactory rates ranging
- 20 50% to 90%, and a consensus on the optimum approach does not exist.<sup>26</sup> Thus, multiscale imagebased simulation is becoming a powerful tool which can provide guidance in defining the optimum ablation strategy.

# Outline

The purpose of this paper is to briefly review some of the multiscale computational models of myocardial ischaemia and MI developed in the past twenty years. The review begins with a discussion of different models of acute ischaemia at the cellular level and then deals with the modelling of ischaemia-related tissue heterogeneities (i.e. the ischaemic border zone). Then, simulations of the electrical consequences of regional ischaemia (in the form of increased reentrant-type arrhythmia vulnerability) are discussed, both in phase 1A and phase 1B ischaemia. Next, models for the electrical and structural remodelling of infarcted tissue are presented. Finally, simulation of the electrical activity

in chronically infarcted tissue is discussed, including a very novel approach to myocardial ablation which uses image-based electrical simulations.

#### SIMULATION OF ISCHAEMIA AT THE CELLULAR LEVEL

It has been known for many years that acute ischaemia has three major components that result from cessation of blood flow: acidosis, hypoxia and hyperkalaemia.<sup>27,28</sup> Intracellular and extracellular pH values can drop from 7.2-7.4 to 6.2-6.4 in the first 10-20 minutes of ischaemia.<sup>29</sup> Oxygen deprivation provokes a moderate decline in ATP levels and an increase in ADP concentration in the intracellular medium.<sup>30</sup> Extracellular K<sup>+</sup> concentration ([K<sup>+</sup>]<sub>o</sub>) can increase more than two-fold in the first 10-15 minutes post occlusion before plateauing for another 15-20 minutes.<sup>31-34</sup> Each of these phenomena affects ion channels (and thereby APs) in a different manner<sup>35</sup> and ultimately set the stage for reentrant activity.<sup>7</sup>

# Simulating acidosis in phase 1A ischaemia

In almost all ischaemic cellular models, the effects of acidosis are mimicked by reducing the maximum conductance of the fast Na<sup>+</sup> channels and the L-type Ca<sup>2+</sup> channels.<sup>36-38</sup> A direct 15 consequence of these changes is a reduction in cell excitability and upstroke velocity.<sup>39,40</sup> Very recently, Roberts and Christini included the Na<sup>+</sup>/H<sup>+</sup> and other exchangers in the Luo-Rudy model<sup>41</sup> in order to analyse reperfusion arrhythmogenesis,<sup>42</sup> creating a new model which can accurately reproduce acidosis in acute ischaemia.

## Simulating hypoxia in phase 1A ischaemia

- 20 Simulation of the electrophysiological effects of hypoxia has historically deserved much attention. The decline in ATP level reduces Na<sup>+</sup>/K<sup>+</sup> pump (I<sub>NaK</sub>) activity and activates the ATP-sensitive K<sup>+</sup> current (I<sub>K(ATP)</sub>),<sup>43</sup> which is almost dormant in normoxic myocardium. To assess the electrophysiological effects of I<sub>K(ATP)</sub> activation, Ferrero *et al.*<sup>44</sup> proposed a model for I<sub>K(ATP)</sub> which included the modulation exerted by ATP and ADP,<sup>30</sup> intracellular Mg<sup>2+</sup> and Na<sup>+ 45</sup> and [K<sup>+</sup>]<sub>o</sub>.<sup>45</sup> This
- 25 model was incorporated into the Luo-Rudy ionic model<sup>24,45</sup> and APs were simulated under hypoxic conditions to try to elucidate the role of I<sub>K(ATP)</sub> activation in the well-known APD shortening in acute ischaemia.<sup>47</sup> The main results of the simulations, depicted in Figure 1A, showed that opening of very few (less than 1%) K<sub>ATP</sub> channels may provoke a strong shortening in APD, with activation of only 0.6% of K<sub>ATP</sub> channels needed to account for a 50% reduction in APD. These results confirmed the validity of the "spare channel hypothesis"<sup>48</sup> in the heart, something which was not completely clear in
  - 3

view of some experimental results.<sup>49</sup> According to the results by Ferrero *et al.*, hyperkalaemia was only a secondary factor in explaining APD shortening during phase 1A ischaemia. Using a similar model for  $I_{K(ATP)}$ , Shaw and Rudy arrived to analogous results.<sup>39,50</sup>

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not well understood.

Recently, a new and more comprehensive model for  $I_{K(ATP)}$  was developed. Using new experimental data on Mg<sup>2+</sup>, ATP and MgADP regulation of K<sub>ATP</sub> channels and on the channel structure, Michailova *et al.*<sup>51</sup> reformulated the current and incorporated it to an ionic-metabolic model appropriate for excitation-metabolic coupling simulations under ischaemic conditions in the transmural ventricular wall.<sup>52</sup> The model was used to predict that K<sub>ATP</sub> channels are activated transmurally with the smallest reduction in ATP in epicardial cells and largest in endocardial cells during phase 1A ischaemia and that inhomogeneous accumulation of metabolites in the transmural ventricular tissue may alter K<sub>ATP</sub> channel opening in a very irregular manner, causing differential APD shortening across the ventricular wall.<sup>52</sup>

## Simulating hyperkalaemia in phase 1A ischaemia

The causes and effects of hyperkalaemia have also deserved attention in computational simulation. Ischaemic elevation of [K<sup>+</sup>]<sub>o</sub> forces cellular resting potential to become less negative (diastolic depolarization) and thus reduces cell excitability and delays its recovery (inducing post-repolarization refractoriness, PRR).<sup>53</sup> These effects of hyperkalaemia have been reproduced by simulating APs of single myocytes subject to acutely ischaemic conditions in isolated myocytes<sup>39</sup> and 1D strands.<sup>50</sup> Although these changes in cell excitability are strongly pro-arrhythmic because they promote unidirectional block (UDB) and reentry,<sup>8,9,54,55</sup> the intimate causes of cellular K<sup>+</sup> loss are still

In 2002, Rodriguez *et al.*<sup>56</sup> used a single-cell model which dynamically calculated ion transfer and fluxes between three compartments (intracellular, interstitial cleft and bulk extracellular media) in ischaemic conditions. To simulate ionic currents and APs, the model used the Luo-Rudy membrane

- kinetics<sup>24,46</sup> including the formulation of I<sub>K(ATP)</sub> by Ferrero *et al.*<sup>44</sup> and an ischaemia-activated slow Na<sup>+</sup> current (I<sub>NaS</sub>).<sup>57</sup> Figure 1B depicts the main results obtained with the model. According to the simulations, the concurrence of three mechanisms is needed to explain the biphasic time-course of [K<sup>+</sup>]<sub>o</sub> in phase 1A ischaemia, namely I<sub>K(ATP)</sub> current activation,<sup>58</sup> I<sub>NaK</sub> partial inhibition<sup>59</sup> and I<sub>NaS</sub> activation.<sup>57,58,60</sup> The participation of only one or two of these mechanisms cannot explain the
- 30 experimentally observed [K<sup>+</sup>]<sub>o</sub> increase neither quantitatively nor qualitatively. Due to the non-linear

nature of the phenomenon, the algebraic addition of the separate effects of the three mechanisms (trace IV in Figure 1B) does not reproduce the time-course of  $[K^+]_o$  either. However, if the three mechanisms take place simultaneously, the non-linear interactions between them increases the rate of  $[K^+]_o$  rise, generates a plateau and the biphasic increase of  $[K^+]_o$  can be nicely reproduced (trace VIII in

- 5 Figure 1B). Interestingly, the quantitative contribution of I<sub>K(ATP)</sub> to the rise in [K<sup>+</sup>]<sub>o</sub> is almost negligible (trace I), but its participation is essential to generate the plateau in [K<sup>+</sup>]<sub>o</sub> (compare traces VII and VIII). The simulations also show that K<sup>+</sup> efflux mainly takes place through the time-independent K<sup>+</sup> channels (I<sub>K1</sub>). Although these findings are difficult to be obtained using solely experimental means, further experiments should be undertaken in order to confirm the hypothesis suggested by the model.
- 10 Incorporating the effects of acidosis, hypoxia and hyperkalaemia into an AP model, the electrical activity of the phase 1A ischaemic cell can be computed and explained.<sup>39,50</sup> Figure 1C shows simulated APs of an isolated myocyte during four different stages of phase 1A ischaemia (0, 3, 7 and 11 minutes post occlusion, respectively).<sup>56</sup> The changes observed in APs are consistent with experimental findings.<sup>30,32,35,61</sup>

# 15 Simulating phase 1B ischaemia

In order to simulate phase 1B ischaemia, Pollard *et al.* proposed additional modifications in ionic currents and intracellular Ca<sup>2+</sup> handling, including the acidotic inhibition of the Na<sup>+</sup>/Ca<sup>2+</sup> exchanger, an enhancement of the background Ca<sup>2+</sup> current and the non-selective Ca<sup>2+</sup>-sensitive cation current, and a reduction in the sarcoplasmic reticulum Ca<sup>2+</sup> release current and the SERCA

20 pump.<sup>62</sup>

## THE BORDER ZONE IN ACUTE ISCHAEMIA

#### Modelling border zone gradients

In most cases, ischaemia is caused by the occlusion of a coronary artery and thus its nature is regional. A central ischemic zone (CIZ) is formed, constituted by cells directly affected by the lack of

- blood flow, while cells away from the CIZ are unaltered and form the normal zone (NZ). The transition between both zones is not abrupt but instead an ischaemic border zone (BZ) develops in which a gradient of ion and metabolite concentrations exists. This high degree of heterogeneity sets the stage for reentry.<sup>63,64</sup> The width of the BZ for each species is variable and has been characterized experimentally for some ions (particularly K<sup>+</sup>)<sup>65-68</sup>, but the profile and extension of the BZ for other species remains unclear.
  - 5

Potse *et al.* used a one-dimensional (1D) diffusive model for  $K^+$  ions to establish the spatial profile of  $[K^+]_o$  across the BZ.<sup>69</sup> The results predict a non-linear  $[K^+]_o$  spatial evolution within the BZ, showing a steep rise in the BZ adjacent to the NZ and a more flattened behaviour near the CIZ. The authors demonstrate that the diffusion constant which would be needed to explain the experimentally

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observed profile of K<sup>+</sup> in the BZ is too large, suggesting that physical diffusion is not the only mechanism that plays a role in the establishment of the BZ. Pulsative flow in the arterial and venous bed could be the other mechanism involved.<sup>67</sup>

More recently, Niederer extended the model to other species (Na<sup>+</sup>, Ca<sup>2+</sup>, Cl<sup>-</sup> and H<sup>+</sup>, among others).<sup>70</sup> An experimental measurement of the gradients of these ions in ischaemia is hampered by

- 10 low spatial and/or temporal resolutions.<sup>67,71</sup> The model developed by Niederer is extremely comprehensive, as it includes dynamic descriptions of membrane kinetics, ionic currents, diffusive ion fluxes and Ca<sup>2+</sup> regulation. The author was able to simulate the spatio-temporal profile of intracellular and extracellular concentrations. The results show that the ischaemic BZ is larger for extracellular K<sup>+</sup> (four times wider than the Na<sup>+</sup> BZ, for instance), which can be explained by the voltage-dependent
- 15 nature of K<sup>+</sup> channels, and also that intracellular and extracellular K<sup>+</sup> concentrations may decrease within the CIZ due to electrogenic drift.

#### Simulating electrical activity in regional ischaemia

When the NZ, BZ and CIZ are included in a tissue model coupled to an ischaemic AP model, the electrical activity of an acutely ischaemic tissue can be simulated. Ferrero *et al.*<sup>72</sup> conducted simulations in an electrophysiologically detailed two-dimensional (2D) anisotropic tissue subject to 10minutes of ischaemia. The tissue comprised a circular CIZ surrounded by a ring-shaped BZ with a width of 1 cm for [K<sup>+</sup>]<sub>o</sub> and pH<sup>65,73,74</sup> and 1 mm for ATP/ADP,<sup>74</sup> enclosed in normal tissue (NZ). The results, shown in Figure 2, reveal profound electrophysiological changes within the BZ under normal pacing. First, CV slightly increases when entering the BZ (due to "supernormal conduction"),<sup>50</sup> but

- 25 decreases in the second half of the BZ, plateauing at approximately 1/3 of its normal value in the CIZ due to the combined effects of hyperkalaemia and acidosis (see Figure 2A). Second, an sharp reduction in APD and effective refractory period (ERP) is found in the normal side of the BZ (due to abrupt I<sub>K(ATP)</sub> activation in the first millimetre of the BZ), but ERP subsequently increases across the BZ reaching almost normal values in the CIZ, mainly due to hyperkalaemia (Figure 2B). Thus, the model
- 30 predicts a strong gradient in ERP across the BZ and a high degree of PRR (>80 ms) in the CIZ, which

is consistent with experimental findings by Zaitsev *et al.* in regionally ischaemic pig hearts.<sup>64</sup> Third, as shown in Figure 2C, acidosis and hyperkalaemia strongly reduce the inward Na<sup>+</sup> current ( $I_{Na}$ ) peak in the CIZ, reaching a value comparable to the L-type Ca<sup>2+</sup> current ( $I_{Ca(L)}$ ) peak. This can be further appreciated in Figure 2D, where the time-course of AP,  $I_{Na}$  and  $I_{Ca(L)}$  during the depolarization and

- early plateau phases is shown. The upstroke of the AP is divided into two distinct components (one supported by I<sub>Na</sub> and the other by I<sub>Ca(L)</sub>), something which has been observed experimentally.<sup>7,53,75,76</sup>
   The enhanced role of I<sub>Ca(L)</sub> in ischaemic propagation favours conduction block and the appearance of alternans, which in turn may provoke reentry as demonstrated also by Shaw and Rudy<sup>40</sup> and Bernus *et al.*<sup>77</sup> This highly heterogeneous substrate favours reentrant arrhythmias.
- 10 When phase 1B ischaemia is reached, the midmyocardial part of the CIZ becomes inexcitable,<sup>78</sup> acting as a partially depolarized sink. Viable cell layers survive in the subepicardium and the subendocardium, with ischaemic damage increasing over time.<sup>79</sup> Cellular uncoupling between the inexcitable midmyocardium and the survival layers begins to develop.<sup>10</sup> This substrate was modelled by Jie *et al.* to study phase 1B ischaemia arrhythmogenesis.<sup>80,81</sup>

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# VULNERABILITY TO REENTRY IN ISCHAEMIA

Using the same tissue model for phase 1A ischaemia described previously, Ferrero *et al.* studied the inducibility of reentry<sup>72</sup>. When paced at the same site as the basic beat, a premature stimulus could induce figure-of-eight reentrant patterns which nicely resembled those obtained experimentally.<sup>8,9,63,82</sup>

- 20 Similar reentrant patterns were obtained from simulations conducted in a three-dimensional (3D) reconstruction of the human ventricles with realistic anatomy and structure (obtained from diffusion tensor magnetic resonance imaging [DT-MRI]) and transmural heterogeneity (with different ionic computational models for epicardial, endocardial and midmyocardial cells).<sup>83</sup> Figure 3 shows the transmembrane potential distribution in selected instants just after the delivery of a premature stimulus
- 25 in the subendocardial BZ, where premature excitations (the trigger for arrhythmia induction) normally originate.<sup>8,35,73,76</sup> An arc of functional conduction block develops in the innermost side of the BZ (third snapshot), caused by the prolonged refractoriness of the tissue (PRR is near its maximum at that site), giving rise to UDB and figure-of-eight reentry.<sup>84</sup>

#### The time-course of arrhythmia vulnerability

According to different experimental and clinical observations, the likelihood of arrhythmic events reaches a maximum before the 10<sup>th</sup> minute, decreases again giving rise to an arrhythmias-scarce period at the end of phase 1A, and increases subsequently in phase 1B.<sup>11,12,85</sup> The reasons for

- 5 this triphasic behaviour are still not completely established. Using the same 2D model described above, Trenor *et al.* studied the time-evolution of reentry inducibility during the first 10 minutes of ischaemia.<sup>86</sup> The authors quantified the "vulnerable window" (VW, defined as the time interval during which a premature stimulus delivered after a conditioning stimulus triggers reentry) at selected time points post occlusion. The results were consistent with experimental observations: the VW begins to
- 10 increase 6.5 minutes after the onset of ischaemia, peaks at the 8<sup>th</sup> minute and vanishes in the 9<sup>th</sup> minute. According to the simulation results, reentry needs the combination of severe hyperkalaemia with moderate hypoxia and acidosis to occur, and those conditions are met in the third quarter (minutes 5 to 7.5) of phase 1A ischaemia. Severe hyperkalaemia ([K<sup>+</sup>]<sub>o</sub>>12 mmol/L) is needed to generate enough PRR to create an arc of block, while strong acidosis (weak I<sub>Na</sub> and I<sub>Ca(L)</sub>) and/or
- 15 hypoxia (strong I<sub>K(ATP)</sub>) would in turn block retrograde propagation in the CIZ creating a BDB that prevents reentry.<sup>86</sup>

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Using the same AP and tissue and model, the same group conducted simulations to assess the proarrhythmic or antiarrhythmic effects of two well-known drugs. According to their simulation results, pinacidil<sup>87</sup> was shown to be proarrhythmic (incrementing the VW) at low concentrations but protective at concentrations higher than 10  $\mu$ mol/L,<sup>88</sup> while lidocaine<sup>89</sup> facilitates the onset of reentry in ischaemic ventricular tissue.<sup>90</sup>

In a similar study using a 2D slice of virtual acutely ischaemic ventricular tissue, Tice *et al.* highlighted the importance of transmural heterogeneity in the development of phase 1A arrhythmias.<sup>4</sup> Experimental studies usually focus on epicardial manifestations of arrhythmias due to logical

- 25 limitations related to the penetration depth of optical mapping techniques. In their simulation study, three BZs (lateral, endocardial and epicardial) of different widths were defined, and transmural heterogeneities in the ischaemic severity were included (with  $[K^+]_o$  rising at a faster rate in the subendocardium and hypoxia affecting more severely in the subepicardium). Their results suggest that transmural gradients of  $I_{K(ATP)}$  activation strongly increase arrhythmogenesis, with almost no sustained
- 30 reentrant activity observed in the absence of  $I_{K(ATP)}$  heterogeneity. Reentrant likelihood also peaked in

the 8<sup>th</sup> minute post occlusion. The importance of transmural ischaemic heterogeneity was also stressed in the work by Weiss *et al.* which used a 3D model of the human ventricles.<sup>91</sup>

#### Dispersion of refractoriness and arrhythmia vulnerability

According to different experimental<sup>64,68,92</sup> and theoretical<sup>93,94</sup> studies, spatial dispersion of
repolarization and/or refractoriness increases reentry vulnerability. Romero *et al.* used a 2D ventricular model developed by Ferrero *et al.*<sup>72,86</sup> to test this hypothesis in the case of phase 1A ischaemia.<sup>95</sup>
According to their results, summarized in Figure 4, ERP dispersion and arrhythmia vulnerability only correlate well in the first 8 minutes of ischaemia but diverge in the last part of phase 1A, when arrhythmias cease to occur but ERP dispersion keeps increasing. According to their results, UDB took
place in cells completely recovered from refractoriness in almost 50% of reentries. The authors argue that local source-sink relationship determines the formation of UDB, and propose a modified version of the safety factor (which quantifies the sink-source mismatch in the propagation process)<sup>96,97</sup> as a better tool to analyse the causes of UDB in ischaemia.

#### The role of mechanoelectrical feedback

In all the simulations mentioned above, the trigger for reentry was artificially applied in the form of a premature stimulus externally delivered at a certain site (normally the subendocardial BZ)<sup>8,73,76</sup>, so no inference can be made about the originating mechanism of reentry. Recent multiscale simulations by Jie *et al.* suggest that mechanoelectrical feedback may play a pivotal role.<sup>98</sup> The simulations involved 3D anatomically and structurally accurate virtual rabbit ventricles in which

- 20 occlusion of the LAD artery was simulated. The ionic model employed included a mathematical description of two distinct mechanosensitive channels,<sup>99</sup> and it also included a novel bidomain electromechanical model. According to their results, mechanosensitive ionic channels<sup>100</sup> are recruited due to the non-uniformity of mechanical strain during acutely ischaemic contractions, resulting in suprathreshold depolarizations in the BZ which act as the trigger of the premature beat that, in turn,
- elicits reentry. Additionally, delayed after-depolarizations (DAD) also resulting from mechanoelectrical feedback in the ischaemic region can contribute to lower excitability, enhancing refractoriness in the CIZ and favouring reentry.

#### Arrhythmias in phase 1B ischaemia

Less attention has been paid to the mechanisms of arrhythmias in phase 1B ischaemia. In 2003, Pollard *et al.* conducted simulations in a 1D strand comprising 1 cm of normal tissue coupled to

1 cm of cells affected by phase 1B ischaemia.<sup>101</sup> The results indicated that suprathreshold DADs develop in the ischaemic zone and only propagate to normal tissue in the form of APs when intermediate uncoupling between the two zones is present. The fact that moderate uncoupling is an important contributor to phase 1B arrhythmogenesis was further stressed by the work of Jie *et al.*<sup>80</sup> in

- 5 which they coupled an inexcitable midmyocardial zone to a surviving subepicardial layer via a thin coupling layer. The results suggested that heterogeneous uncoupling between layers enhance ERP dispersion in the subepicardium, thus increasing reentry vulnerability. Complete uncoupling eliminated arrhythmias. In a more recent work, Jie and Trayanova improved the model by using 3D rabbit ventricle geometry and simulating a more complex substrate structure which comprised a CIZ with
- 10 inexcitable midmyocardium and surviving subepicardial and subendocardial layers, as well as lateral BZs.<sup>81</sup> According to their results, the degree of hyperkalaemia in the subepicardium was key, as it led to the induction of reentrant activity. Vulnerability to reentry was biphasic, with increased cellular uncoupling and reduction of the width of the lateral BZ increasing reentry inducibility.

#### Simulating global ischaemia

15 When ischaemia results from a coronary artery occlusion, it is regional by nature, but during ventricular fibrillation (VF) ischaemia becomes global as perfusion of the myocardium is interrupted. However, simulation works dealing with global ischaemia are not as abundant as those that model regional ischaemia. Among them, a recent paper<sup>102</sup> simulates global ischaemia in a 2D virtual tissue to provide some insights into the effects of ischaemia on the organization of VF. With a different aim,

20 Rodriguez *et al.* simulated global ischaemia in a 2D slice of myocardium<sup>103</sup> and in 3D rabbit ventricles<sup>104</sup> to study the effects of phase 1A global ischaemia on the upper limit of vulnerability to electric shocks in the context of electrical defibrillation.

# ELECTRICAL AND STRUCTURAL REMODELLING IN INFARCTED TISSUE

Three to five days after the initial ischaemic event, electrical<sup>13,14</sup> and structural<sup>13</sup> remodelling of the epicardial BZ (EBZ) begins. These changes in the substrate can eventually generate arrhythmias in the subacute and chronic phases of MI<sup>105</sup> and have received attention in the past 10 years from the computational simulation community.

#### Electrical remodelling

Within the EBZ, experimental studies have recorded shorter,<sup>13</sup> similar<sup>13,106</sup> or longer<sup>107</sup> APD than in normal myocardium. However, the EBZ has a longer refractory period due to the existence of

PRR.<sup>14,108</sup> Using experimental data from remodelled ionic currents, Cabo and Boyden formulated a computational model for EBZ cells.<sup>109</sup> They modified the Luo-Rudy model to include alterations in the maximal conductance and kinetics of  $I_{Na}$ ,<sup>106</sup>  $I_{Ca(L)}$ ,<sup>110</sup>  $I_{Kr}$ ,<sup>111</sup>  $I_{Ks}$ ,<sup>112</sup> and  $I_{K1}$ .<sup>112</sup> More recently, Decker and Rudy<sup>113</sup> developed a new model of the remodelled EBZ by additionally altering the maximum conductance and kinetics of  $I_{to2}$ .<sup>114</sup> and  $I_{to1}$ .<sup>106</sup> Applying these modifications to the basic Luo-Rudy

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conductance and kinetics of  $I_{to2}^{114}$  and  $I_{to1}^{106}$  Applying these modifications to the basic Luo-Rudy model, the authors were able to reproduce the aforementioned features of APs of cells in the EBZ. Even more recently, McDowell *et al.* adapted a rabbit AP model in the same direction.<sup>115</sup>

#### Structural remodelling

In reference to structural remodelling, gap junctional changes and fibrotic remodelling have
been observed in post-infarcted hearts<sup>112,113</sup> with conduction disturbances observed in the healing infarct BZ being related to intercellular uncoupling.<sup>117,118</sup> Marked alterations in the organization of intercellular connections occur in the EBZ, leading to non-uniform conduction, fractionated electrograms and reentry.<sup>118</sup> Several theoretical investigations using computer simulations have addressed the role of altered cellular coupling on AP conduction.<sup>119,120</sup> Cellular uncoupling not only decreases conduction velocity, but it may create a substrate that facilitates the propagation of ectopic activity.<sup>121,122</sup> It is thus an important factor to consider when implementing realistic electrical models of the infarcted heart in the subacute and chronic phases.

Experimental evidence exists according to which myofibroblasts proliferate following myocardial infarction, especially in the peri-infarct zone.<sup>123,124</sup> Electrical coupling between

- 20 myofibroblasts and myocytes is well established in cell culture<sup>125</sup> and the presence of fibrotic areas in the ventricle leads to altered and discontinuous conduction and fractionated electrograms.<sup>126,127</sup> Several theoretical studies focusing on the electrotonic coupling between fibroblasts and myocytes use computational models of the passive and active electrical behaviour of fibroblasts.<sup>128-130</sup> Simulations reveal significant electrophysiological consequences of coupling fibroblasts to myocytes at
- 25 the cellular level, such as partial diastolic depolarization of the myocyte and significant shortening of its APD.<sup>128</sup> Also, the critical pacing cycle length at which alternans occur is changed by fibroblastmyocyte coupling.<sup>131</sup> In results obtained from 1D and 2D simulations, conduction disturbances arise in the presence of fibrosis<sup>132,133</sup> and changes in electrical restitution properties occur, leading to spiral wave instability.<sup>134,135</sup> Using 2D simulations, Xie *et al.* observed an increased vulnerability to reentry in

the presence of fibrosis.<sup>131</sup> Fractionated electrograms were also obtained in 2D simulated ventricular tissues with different fibrosis densities.<sup>136</sup>

#### SIMULATION OF MYOCARDIAL INFARCTION AT THE ORGAN LEVEL

- Three-dimensional ventricular simulations including fibrosis are very recent. McDowell *et al.* 5 simulated the electrical activity of anatomically realistic rabbit ventricles in the presence of an infarction scar, a remodelled peri-infarct zone and different levels of fibrosis.<sup>115</sup> The authors observed an increase in the vulnerability to reentry in the presence of intermediate fibrosis, while high densities of fibroblasts reduced the probability of reentry. To run the simulations, they developed a 3D computational model of the chronically infarcted rabbit ventricles based on MRI. Recent advances in
- 10 MRI technologies have facilitated the imaging of geometry and tissue architecture at improved resolution, so image-based methods have been recently developed to construct computational models,<sup>137</sup> and many of them focus on the arrhythmogenic behaviour of the infarcted heart.

Rantner *et al.* analysed the mechanisms of decreased defibrillation efficacy in infarcted hearts using an improved model of the rabbit infarcted ventricle.<sup>138</sup> Vigmond *et al.* analysed reentrant

- 15 mechanisms in a canine infarction 3D model also using image-based modelling techniques.<sup>139</sup> Their model included a scar and the BZ with electrical remodelling. Swine models of myocardial infarction have also been reconstructed based on MRI.<sup>140-142</sup> Pop *et al.*<sup>140</sup> showed that computer simulation based on ex-vivo DT-MRI could predict the VT circuit obtained in swine electrophysiological studies. Their 3D model included healthy tissue, scar and BZ using a two-variable model of the AP. Similarly,
- 20 Ng *et al.*<sup>142</sup> included electrically remodelled grey zones and infarct cores in swine hearts. VT was induced in different virtual models and showed that a combination of infarct scars and peri-infarct zones is needed for VT generation. Similar reentrant circuits were obtained in the electrophysiological studies and in the virtual ones, demonstrating that image-based modelling may be helpful when planning catheter ablation strategies. Indeed, very recently, Ashikaga *et al.* tested the feasibility of
- <sup>25</sup> image-based simulation to estimate ablation targets in human VT, highlighting the effectiveness of this non-invasive tool.<sup>143</sup> As shown in Figure 5, their model includes infarct zones, grey zones with electrical remodelling, and healthy zones. When ablation in the human patient was done within the zone predicted by the model, successful termination of reentry was accomplished. This model is state-of-the-art in image-based simulation oriented to ablation strategy optimization.

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#### SUMMARY

This article provided a brief review of some of the multiscale computational models of myocardial ischaemia and MI developed in the past years. The models discussed here are examples of how computer simulations may help to understand the electrical consequences of ischaemia and MI

- 5 and to improve treatments of subsequent cardiac arrhythmias. At the cellular level, simulations have contributed to elucidate the ionic mechanisms responsible for the ischaemia-induced changes in APs and ionic concentrations and have aided in better understanding how the ischaemic border zone is established. Regarding ischaemic arrhythmogenesis, the models have helped to clarify the role of acidosis, hypoxia and hyperkalaemia in the onset and maintenance of ischaemic reentry and to
- 10 theoretically explain the biphasic nature of arrhythmia vulnerability in phase 1A ischaemia. Simulations have also shed new light on the role of dispersion of refractoriness, source-sink mismatch and mechanoelectrical feedback in arrhythmogenesis.

Today, computational simulations are also helping to improve therapeutic techniques to stop and/or prevent arrhythmias in ischaemic patients. Modelling the interaction between different drugs (such as lidocaine or pinacidil) and their molecular targets has enabled us to explain (and, ideally,

predict) the proarrhythmic or antiarrhythmic effects of these drugs in an ischaemic scenario. Also, recent works are beginning to show how computer simulations can be useful to improve electrical arrhythmia treatment.

In the task of integrating computer simulation techniques in daily clinical practice in the context of ischaemia and MI, important limitations are yet to be addressed. At the cellular level, ionic models need to be improved using new patch-clamp data from human ischaemic hearts. At the tissue level, it is still impossible to visualize the actual fibre orientation of the in-vivo infarcted heart of a patient. When these and other limitations are overcome, the use of computational simulations to optimize myocardial ablation procedures in infarcted patients,<sup>143</sup> for instance, will become a real possibility.

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#### **Figure legends**

**Figure 1** Simulation of phase 1A ischaemia at the cellular level. (A) Hypoxic action potentials for different activation degrees of ATP-sensitive K<sup>+</sup> channels. Numbers indicate percentage of open channels. Reproduced from Reference 44 with permission. (B) Time-course of extracellular K<sup>+</sup> concentration during acute ischaemia. Each trace corresponds to a different ionic event: progressive activation of ATP-sensitive K<sup>+</sup> channels ( $I_{K(ATP)}$ , trace I), inhibition of the Na<sup>+</sup>/K<sup>+</sup> pump ( $I_{NaK}$ , trace II), activation of an ischaemic slow-activated inward Na<sup>+</sup> current ( $I_{NaS}$ , trace III), algebraic sum of the three traces (trace IV), combinations of two mechanisms (traces V to VII) and combination of the three mechanisms (trace VIII). (C) Action potentials from isolated ventricular myocytes at different minutes post occlusion. Panels (B) and (C) modified from Reference 56 with permission.

**Figure 2** Simulation of regional phase 1A ischaemia in a two-dimensional tissue. (A) Longitudinal conduction velocity in the normal zone (NZ), border zone (BZ) and central zone (CZ) along the vertical strand depicted in panel E. (B) Effective refractory period (ERP) and action potential duration (APD). (C) Peak Na<sup>+</sup> and L-type Ca<sup>2+</sup> currents ( $I_{Na}$ ,  $I_{Ca(L)}$ ). (D) Time-courses of transmembrane potential ( $V_m$ ),  $I_{Na}$  and  $I_{Ca(L)}$  in the centre cell. (E) Schematic of the tissue. Reproduced from "Electrical activity and reentry during acute regional myocardial ischaemia: insights from simulations", Ferrero JM, Trenor B, Rodriguez B & Saiz J, *International Journal of Bifurcation and Chaos*, Vol.13(12), © 2003 World Scientific Publishing Company (Reference 72) with permission.

**Figure 3** Simulation of phase 1A ischaemia at the organ level. Panels show voltage snapshots (colour-coded membrane voltage) corresponding to the anterior epicardial wall at twelve different instants after the delivery of a premature stimulus. The approximate location of the normal zone (NZ), border zone (BZ) and central ischaemic zone (CIZ) is shown in the first panel. The black line in the third panel shows an arc of block.

**Figure 4** Time-course of the vulnerable window duration (VW, panel A) and dispersion of effective refractory period ( $\Delta$ ERP, panel B) during the first 10 minutes of ischaemia. Reproduced from Reference 95 with permission.

**Figure 5** Comparison between image-based simulation of chronic myocardial infarction and standard (non-simulation) approach. (A) Activation map of a simulation of ventricular tachycardia (VT). Arrows indicate wave propagation of reentrant circuits, and lines indicate arcs of block. (B) 12-lead ECG of inducible VTs from the standard approach. (C) Three-dimensional CARTO map with colour-coded voltages (purple: normal myocardium; blue, green and yellow: infarct border zones; red: scar) from the standard approach. Circles represent ablation sites. (D) Pre-ablation magnetic resonance imaging showing infarct geometry (orange: scar; yellow: heterogeneous zone; grey: non-infarcted myocardium). The lines of conduction block from the image-based simulation and the ablation sites from the standard approach are co-registered on the heart geometry. (E) Potential target region for ablation (green area) estimated from the image-based simulation. The shortest possible line of ablation that spans the target region is indicated in cyan. The ablation sites that fell within the estimated ablation target (green area) are indicated by yellow circles. Modified from Reference 143 with permission.

Representative figure: Figure 3



Figure 1

Figure 2





# Figure 3





Figure 5

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