

The role of short term memory and conduction velocity restitution in alternans formation

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Abstract

Alternans is the periodic beat-to-beat short-long alternation in action potential duration (APD), which is considered to be a precursor of ventricular arrhythmias and sudden cardiac death. In extended cardiac tissue, electrical alternans can be either spatially concordant (SCA, all cells oscillate in phase) or spatially discordant (SDA, cells in different regions oscillate out of phase). SDA gives rise to an increase in the spatial dispersion of repolarization, which is thought to be proarrhythmic. In this manuscript, we investigated the effect of two aspects of short term memory (STM) (α , τ) and their interplay with conduction velocity (CV) restitution on alternans formation using numerical simulations of a mapping model with two beats of memory. Here, α quantifies the dependence of APD restitution on pacing history and τ characterizes APD accommodation, which is an exponential change of APD over time once basic cycle length (BCL) changes. Our main findings are as follows: In both single cell and spatially coupled homogeneous cable, the interplay between α and τ affects the dynamical behaviors

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of the system. For the case of large APD accommodation ($\tau \geq 290$ ms), increase in α leads to suppression of alternans. However, if APD accommodation is small ($\tau \leq 250$ ms), increase in α leads to appearance of additional alternans region. On the other hand, the slope of CV restitution does not change the regions of alternans in the cable. However, steep CV restitution leads to more complicated dynamical behaviors of the system. Specifically, SDA instead of SCA are observed. In addition, for steep CV restitution and sufficiently large τ , we observed formations of type II conduction block (CB_2), transition from type I conduction block (CB_1) to CB_2 , and unstable nodes.

Keywords: Action potential duration, Mapping model, Single cell, One dimensional cable, Numerical simulation.

1. Introduction

Alternans (or so called 2:2 response), a condition in which there is a beat-to-beat alternation in the action potential duration (APD) of a periodically stimulated cardiac cell, has been linked to the genesis of life-threatening ventricular arrhythmias Pastore et al. (1999); Zipes and Wellens (1998); Franz (2003); Myerburg and Spooner (2001). In the heart, alternans can be spatially concordant (SCA) or spatially discordant (SDA). SCA is a phenomenon in which all cells oscillate in phase. SDA is the phenomenon of two spatially distinct regions displaying APD alternans of opposite phases. These regions are separated by nodal lines in which no alternans is present. SDA has recently been related to T wave alternans, a periodic beat-to-beat variation in the amplitude or shape of the T wave in an electrocardiogram Pastore et al. (1999); Zipes and Wellens (1998). T wave alternans is associated with the vulnerability to ventricular arrhythmias and sudden cardiac

14 death. Therefore, it is accepted that SDA can promote the occurrence of wave-
15 break and subsequently, reentry Pastore et al. (1999); Pastore and Rosenbaum
16 (2000); Pruvot and Rosenbaum (2003) in the heart, and thus it is proarrhythmic.
17 However, the mechanisms of SDA are not completely understood.

18 Several mechanisms of SDA formation have been proposed. The first mecha-
19 nism requires preexisting tissue heterogeneities. SDA can be formed via a timed
20 stimulus or faster pacing rate around regions of heterogeneities Pastore et al.
21 (1999); Chinushi et al. (2003); Pastore et al. (2006). However, as indicated in
22 several numerical studies, tissue heterogeneity is not essential for SDA forma-
23 tion Watanabe et al. (2001); Qu et al. (2000). For example, it has been revealed
24 that SDA can form in a perfectly homogeneous tissue via a pure dynamic mecha-
25 nism Watanabe et al. (2001). The second proposed mechanism for SDA is a steep
26 dependence of conduction velocity (CV) on the preceding diastolic interval (DI)
27 Franz (2003); Watanabe et al. (2001); Fenton et al. (2002); Fox et al. (2002b);
28 Taggart et al. (2003). A third possible mechanism is unstable intracellular cal-
29 cium cycling, which refers to the steep relation between calcium release versus
30 sarcoplasmic reticulum calcium load Sato et al. (2013). The last possible mecha-
31 nism Mironov et al. (2008) is short term memory (STM). The original assumption
32 was that APD depends only on the preceding DI. However, STM implies the de-
33 pendence of APD on the entire pacing history, not just preceding DI.

34 The above four mechanisms of SDA formation in cardiac tissue can be dis-
35 tinguished from the behaviors of nodal lines. Nodal lines formed by tissue het-
36 erogeneities are displayed by one of the following two scenarios Hayashi et al.
37 (2007). First, once a nodal line forms, it can drift away from the pacing site on
38 a beat-to-beat basis without reaching a steady state. Second, the nodal line may

39 reach a steady state but remain pinned as pacing rate increases. In contrast, nodal
 40 lines formed by steep CV restitution reach steady state and move towards the pac-
 41 ing site at faster pacing rates Hayashi et al. (2007). However, nodal lines formed
 42 by unstable calcium cycling are not oriented radially with respect to the pacing
 43 site, and also does not move in response to changes in pacing rate Gizzi et al.
 44 (2013). On the other hand, it has been suggested that STM is related to unsta-
 45 ble behaviors of nodal lines, which means that the nodal lines undergo drifting
 46 when pacing rate increases Mironov et al. (2008). However, in experiments, it is
 47 difficult to identify the role of each individual mechanism (for example, CV resti-
 48 tution and STM) in alternans formation. In addition, the interplay between these
 49 two mechanisms is still unclear.

50 Therefore, in this manuscript, we aimed to uncover the mechanisms of SDA
 51 formation using numerical simulations of a mapping model with two beats of
 52 memory that was previously introduced in Tolkacheva et al. (2004). This is a
 53 rather simple yet powerful tool to determine the contributions of STM to alter-
 54 nans formation in single cell. In addition, to identify the individual contributions
 55 of STM and CV restitution to SDA formation, we will perform numerical simula-
 56 tions of the mapping model in a homogeneous cable.

57 We adopted the mapping model in the following form Tolkacheva et al. (2004):

58

$$A_{n+1} = F(D_n, A_n, D_{n-1}), \quad (1.1)$$

59 where A_n and D_n are APD and DI at the n^{th} stimulus. Note that, in Eq. (1.1),
 60 APD depends not only on the preceding DI, but also on the previous APD and
 61 earlier DI, which indicates the presence of two beats of STM in the model. We
 62 considered the case of periodic pacing of constant basic cycle length (BCL), for

63 which relation $A_n + D_n = \text{BCL}$ holds.

64 2. Materials and Methods

65 2.1. Mapping model with two beats of memory

For exact form of Eq. (1.1), we used a mapping model that was introduced in Fox et al. (2002a):

$$A_{n+1} = (1 - \alpha M_{n+1})G(D_n), \quad (2.1a)$$

$$M_{n+1} = [1 - (1 - M_n)\exp(-A_n/\tau)]\exp(-D_n/\tau), \quad (2.1b)$$

where

$$G(D_n) = Q + \frac{R}{1 + \exp(-(D_n - S)/T)}$$

and α and τ are two aspects of STM, which represent rate-dependent restitution and APD accommodation, respectively. Rate-dependent restitution is measured as the difference between slopes of different restitution curves calculated at the same BCL Tolkacheva and Zhao (2012). APD accommodation refers to the slow change of APD over time after an abrupt change in BCL. Note that, large α refers to more disparity between APD restitution curves, and large τ refers to more APD accommodations. We chose the following parameters in Eq. (2.1),

$$Q = 115 \text{ ms}, R = 121 \text{ ms}, S = 42.5 \text{ ms}, T = 20.2 \text{ ms},$$

66 since these values allowed the mapping model to fit with the steady state solutions
67 from a physiological model of action potential.

68 In order to investigate the effect of STM on alternans formation using mapping
69 model (2.1), we varied α from 0 to 1 and chose three different values of τ : 11.4 s
70 (large APD accommodation), 260 ms and 200 ms (small APD accommodation).

71 2.2. *Spatially coupled mapping model*

72 In order to model a one dimensional cable, we adopted a spatially coupled
73 mapping model (2.2) by adding diffusion and advection terms to Eq. (1.1), as
74 suggested in Fox et al. (2003):

$$A_{n+1} = F(D_n, A_n, D_{n-1}) + \xi^2 \nabla^2 A_{n+1} - \omega \nabla A_{n+1}, \quad (2.2)$$

75 where $\xi = 1$, $\omega = 0.35$. The choices of ξ and ω were based on Fox et al. (2003);
76 Echebarria and Karma (2007), and detailed justification can be seen in Appendix.
77 Here, the diffusion term $\xi^2 \nabla^2 A_{n+1}$ represents the coupling between cells, and the
78 advection term $-\omega \nabla A_{n+1}$ depicts the asymmetry of influence by its left and right
79 neighbors, considering that cells are activated at different times by the propagating
80 wave front Echebarria and Karma (2002, 2007). The distribution of $D_n(x)$, the n^{th}
81 DI along the cable has been described in Watanabe et al. (2001):

$$\frac{dD_n(x)}{dx} = \frac{1}{V(D_n(x))} - \frac{1}{V(D_{n-1}(x))} - \frac{dA_n(x)}{dx}, \quad (2.3)$$

82 where x is the position along the cable and V represents a CV restitution curve.
83 Note that, $A_n(0) + D_n(0) = \text{BCL}$. We combined Eq. (2.2) with Eq. (2.3) to solve
84 A_{n+1} along a cable with length $L = 4$ cm, Fox et al. (2003). Due to the finite length
85 of the cable, we imposed the Neumann boundary condition, $\frac{\partial A_{n+1}}{\partial x}|_{x=0,L} = 0$, on
86 the two ends of the cable to minimize the boundary effect. To investigate the
87 effect of CV restitution on SDA formation, we used steep (V_1) and shallow (V_2)
88 restitution curves, as shown in Fig. 1,

$$\begin{aligned} V_1(D_n) &= 0.4 - 0.3 \exp(-D_n/10), \\ V_2(D_n) &= 0.4 - 0.03 \exp(-D_n/10). \end{aligned} \quad (2.4)$$

We discretized Eqs. (2.2) and (2.3) along a cable with length L by the following scheme at a spatial step size ($\Delta x = \frac{L}{N}$) of 0.01 cm.

$$\begin{aligned} & -\frac{\xi^2}{\Delta x^2}A_{n+1}(x_{i-1}) + \left(1 + 2\frac{\xi^2}{\Delta x^2} - \frac{\omega}{\Delta x}\right)A_{n+1}(x_i) - \left(\frac{\xi^2}{\Delta x^2} - \frac{\omega}{\Delta x}\right)A_{n+1}(x_{i+1}) \\ & = F(D_n(x_i), A_n(x_i), D_{n-1}(x_i)), \quad i = 1 \cdots N, \end{aligned}$$

$$A_{n+1}(x_0) = A_{n+1}(x_1), \quad A_{n+1}(x_N) = A_{n+1}(x_{N+1}).$$

$$D_n(x_i) = \text{BCL} + \sum_{j=0}^{i-1} \frac{\Delta x}{V(D_n(x_j))} - \sum_{j=0}^{i-1} \frac{\Delta x}{V(D_{n-1}(x_j))} - A_n(x_i),$$

89 where x_i is the i^{th} site along the cable, $\Delta x = x_i - x_{i-1}$.

90 2.3. Pacing protocols

91 In order to study the mechanism of alternans formation after an abrupt change
92 in pacing rate, BCL was decreased from $\text{BCL}_1 = 500$ ms to a different BCL_2 ,
93 ranging from 100 ms to 300 ms. We applied 300 stimuli at BCL_1 and sufficient
94 number of stimuli to reach steady state at BCL_2 .

95 In the cable, pacing was applied at the left end $x = 0$, and the following pa-
96 rameters were recorded: steady state positions of nodes (X_{ss}) and time to reach
97 steady state of the nodes (t_{ss}) at BCL_2 . Here, X_{ss} was defined as a point for which
98 APD node drifts less than 0.1 mm for the ten consecutive stimuli. t_{ss} was recorded
99 from the beginning of pacing at BCL_2 until steady state is reached. (See Table 1
100 for details.)

101 2.4. Overpacing and conduction block

102 One of the general limitations of the mapping model is that in a single cell,
103 APD computed using Eq. (2.1) may be larger than $\text{BCL} - D_{\text{min}}$, where $D_{\text{min}} =$
104 2 ms is the minimum DI for which an action potential can be initiated Fox et al.

105 (2002b, 2003); Otani (2007). Slight changes in D_{\min} did not affect our results
 106 significantly. If $DI < D_{\min}$, then the cell does not produce an action potential,
 107 which will lead to a 2:1 response provided $APD < 2BCL - D_{\min}$. However, if the
 108 cell is further stimulated, it may recover from 2:1 back to 1:1 or 2:2 responses.
 109 This phenomenon is known as overpacing, and it is shown in Fig. 2B.

110 Fig. 2B illustrates responses of mapping model (2.1) when BCL was de-
 111 creased from BCL_1 to BCL_2 . The $(n - 1)^{\text{th}}$ and n^{th} stimuli give rise to action
 112 potentials, while the $(n + 1)^{\text{th}}$ stimulus fails to produce an action potential, since
 113 $A_n > A_1^{\text{thr}} = BCL_2 - D_{\min}$. However, if $A_n < A_2^{\text{thr}} = 2BCL_2 - D_{\min}$, then the
 114 $(n + 2)^{\text{th}}$ stimulus will be able to produce an action potential, and

$$\begin{aligned} D_{n+1} &= 2BCL_2 - A_n, \\ A_{n+2} &= F(D_{n+1}, A_n, D_{n-1}). \end{aligned} \tag{2.5}$$

115 If a cell can not recover from 2:1 response as a result of overpacing, we defined it
 116 as conduction block (CB) for single cell. In general, a $k : 1$ ($k > 2$) response may
 117 be possible if $APD > A_2^{\text{thr}}$.

118 The effect of overpacing on single cell dynamics for the mapping model (2.1)
 119 when BCL was changed from BCL_1 to $BCL_2 = 170$ ms is demonstrated in Fig. 3.
 120 It shows an example of CB (A) and transition from 2:1 to 1:1 responses (B) as a
 121 result of overpacing. Here, $\alpha = 0.1$ (A), $\alpha = 0.6$ (B) and $\tau = 11.4$ s. As observed
 122 in Fig. 3A, APDs (open circles) are always greater than A_1^{thr} (dashed line) but less
 123 than A_2^{thr} (dashed line), indicating a sustained 2:1 response.

124 In contrast, in Fig. 3B, APDs are greater than A_1^{thr} and less than A_2^{thr} at the
 125 beginning of pacing at BCL_2 . But with continued pacing, APD becomes less than
 126 A_1^{thr} , thus indicating the transition from 2:1 response to 1:1 behavior can only be
 127 observed in the presence of overpacing.

128 In a cable, one may have $D_n(x) \geq D_{\min}$ for certain x , whereas $D_n(x) < D_{\min}$
 129 for other x . Several scenarios of dealing with CB and overpacing in the cable
 130 have been discussed in the literature. For example, in Otani (2007), the authors
 131 developed a method that uses the APD and CV restitution relations to generate
 132 predictions regarding which sequences of premature stimuli are most likely to
 133 induce type II CB and reentry. Specifically, block occurs when the trailing edge
 134 of the preceding wave travels slower than the leading edge of the current wave,
 135 allowing the latter to encroach and terminate on the former. In Fox et al. (2003),
 136 simulation was terminated once $D_n(x) < D_{\min}$ occurred for any x in the cable. In
 137 Fox et al. (2002b), overpacing was considered for a cable consisting of a simple
 138 mapping model without memory, $A_{n+1} = f(D_n)$.

139 In this manuscript, we implemented overpacing in the cable for the mapping
 140 model with two beats of STM by using the approach shown in Fig. 2C, which
 141 illustrates responses of spatially coupled mapping model (2.2) when the cable
 142 was paced at $x = 0$ and BCL was decreased from BCL_1 to BCL_2 . As observed,
 143 solid and dashed lines represent the wavefront and waveback of an action potential
 144 along the cable, respectively. Let x^* be the maximal value such that

$$\widetilde{D}_n(x) \geq D_{\min}, \text{ for } x < x^*, \quad (2.6)$$

where $\widetilde{D}_n(x)$ satisfies the following:

$$\frac{d\widetilde{D}_n(x)}{dx} = \frac{1}{V(\widetilde{D}_n(x))} - \frac{1}{V(D_{n-1}(x))} - \frac{dA_n(x)}{dx},$$

$$A_n(0) + \widetilde{D}_n(0) = \text{BCL}.$$

145 Then we let $D_n(x) = \widetilde{D}_n(x)$ for $x < x^*$, where $D_n(x)$ is the n^{th} DI. That is, the
 146 $(n+1)^{\text{th}}$ action potential can only propagate to x^* . Therefore, $A_{n+1}(x)$ also exists

147 for $x < x^*$ (we let $A_{n+1} = 0$ for $x \geq x^*$ to emphasize).

148 Let us consider the situation when the $(n+2)$ th action potential can propagate
 149 to the end. For $x < x^*$, $D_{n+1}(x)$ and $A_{n+2}(x)$ can be obtained by Eqs. (2.2) and
 150 (2.3). For $x \geq x^*$, $D_{n+1}(x)$ and $A_{n+2}(x)$ can be obtained by Eq. (2.7) below.

$$\frac{dD_{n+1}(x)}{dx} = \frac{1}{V(D_{n+1}(x))} - \frac{1}{V(D_{n-1}(x))} - \frac{dA_n(x)}{dx}, \quad (2.7)$$

$$A_{n+2} = F(D_{n+1}, A_n, D_{n-1}) + \xi^2 \nabla^2 A_{n+2} - \omega \nabla A_{n+2},$$

151 where $D_{n+1}(x)$ is the DI that follows either $A_{n+1}(x)$ (for $x < x^*$) or $A_n(x)$ (for
 152 $x \geq x^*$). If the action potential can not propagate to the end of the cable, CB
 153 occurs. Moreover, if CB occurs at $x = 0$, we defined it as type I CB (CB₁). If CB
 154 occurs at $x \neq 0$, we defined it as type II CB (CB₂).

155 3. Results

156 3.1. Dynamical responses of single cell

157 We first aimed to classify different dynamical behaviors of the mapping model
 158 (2.1) at steady state (i.e. 1:1, 2:2, or CB) when BCL was changed from BCL₁ to
 159 various BCL₂. Fig. 4 illustrates steady state responses at different BCL₂ as a
 160 function of α for $\tau = 11.4$ s (A), $\tau = 260$ ms (B), and $\tau = 200$ ms (C). Black
 161 dashed lines outline the regions for 1:1 responses (filled circles or upper right
 162 corner regions labeled as 1:1) and CB. For $\tau = 11.4$ s and 260 ms (Figs. 4A
 163 and 4B), we can see that when BCL₂ is large, only 1:1 responses are observed.
 164 As BCL₂ decreases, CB or 2:2 (or alternans) (crosses) behaviors occur, which
 165 transition to 1:1 responses as α increases. Once BCL₂ becomes sufficiently small,
 166 only CB is observed.

167 Fig. 4C shows different dynamical responses of the mapping model (2.1) for
 168 $\tau = 200$ ms. Here, we can see a larger region occupied by alternans (crosses),
 169 especially for large α . These results suggest that the effect of α is diminished as
 170 τ decreases.

171 The dynamical behaviors of a single cell are different for high and low values
 172 of τ . The cases $\tau = 11.4$ s and $\tau = 200$ ms are two representatives of the respective
 173 regimes. The high τ regime extends to about 290 ms and the low τ regime extends
 174 to around 250 ms. There is a narrow transition regime between $\tau = 250$ ms and
 175 $\tau = 290$ ms, for which we showed the case $\tau = 260$ ms.

176 The individual roles of α and τ in alternans formation can be understood by
 177 considering the limit of M_{n+1} as τ approaches zero. Eq. (2.1b) yields $\lim_{\tau \rightarrow 0} M_{n+1} =$
 178 $\lim_{\tau \rightarrow 0} [1 - (1 - M_n)\exp(-A_n/\tau)]\exp(-D_n/\tau) = 0$, since $A_n, D_n > 0$. Then Eq.
 179 (2.1a) reduces to $A_{n+1} = G(D_n)$, i.e. no memory. Thus, effect of α is diminished
 180 as τ decreases.

181 3.2. SDA in spatially coupled mapping model

182 3.2.1. Effect of overpacing on CB

183 We found that the effect of overpacing has more important consequences on
 184 dynamics in the cable, in comparison to the single cell. To illustrate it, we per-
 185 formed numerical simulations of spatially coupled mapping model (2.2) when
 186 BCL was decreased from BCL_1 to BCL_2 . Figs. 5A – 5E show results for different
 187 stimulus number at $BCL_2 = 220$ ms, $\alpha = 0.175$, $\tau = 11.4$ s and $CV = V_1$. As
 188 observed, Fig. 5A demonstrates that CB_1 occurred at the first beat as BCL was
 189 decreased to BCL_2 , after which SCA (Fig. 5B) and SDA (Figs. 5C and 5D) oc-
 190 curred sequentially. SDA persists for about 40 beats, and then CB_2 (Fig. 5E) is
 191 observed at the 59th beat, at which action potential is blocked in the middle of the

192 cable.

193 In Fig. 5F, we set $BCL_2 = 190$ ms, $\alpha = 0.425$, $\tau = 11.4$ s and $CV = V_1$. As
 194 stimuli number increases, we observed a transition from CB_1 (dashed line) to SDA
 195 (open and filled circles) and then to 1:1 (grey line) behavior under overpacing.
 196 Note that, neither the transition from CB_1 to CB_2 nor the transition from CB_1
 197 to SDA and then to 1:1 response can be observed without overpacing. Instead,
 198 simulations would have terminated at the first beat.

199 3.2.2. SDA node behaviors while approaching steady state

200 We observed two different behaviors of SDA nodes while approaching steady
 201 state: stable and unstable node formation. Fig. 6A shows stable behavior of nodes
 202 for the spatially coupled mapping model (2.2) when BCL was decreased from
 203 BCL_1 to $BCL_2 = 240$ ms, $\alpha = 0.175$, $\tau = 11.4$ s and $CV = V_1$. Note that the node
 204 formed by the 188th and 189th beats (black dashed) appears at the distal end of the
 205 cable and then moves towards (grey and black nodes) the pacing site $x = 0$ as it
 206 approaches steady state X_{ss} .

207 Fig. 6B shows unstable behavior of the node for the spatially coupled mapping
 208 model (2.2) when BCL was decreased from BCL_1 to $BCL_2 = 210$ ms, $\alpha = 0.3$,
 209 $\tau = 11.4$ s and $CV = V_1$. The node formed by the 6th and 7th beats (black dashed)
 210 appears at the end of the cable and migrates towards (grey solid) the pacing site
 211 $x = 0$ first, and then away from (black solid) the pacing site $x = 0$ as it approaches
 212 steady state X_{ss} .

213 For the stable nodes, we calculated the steady state positions (X_{ss}) and time to
 214 reach steady state (t_{ss}). Figs. 7A and 7B are representative examples displaying
 215 X_{ss} and t_{ss} as a function of α respectively. Both figures were obtained for the
 216 spatially coupled mapping model (2.2) when BCL was changed from BCL_1 to

217 $BCL_2 = 130\text{ms}$, where $\tau = 200\text{ ms}$ and $CV = V_1$. As depicted, X_{ss} increases
 218 as α increases and t_{ss} first decreases and then increases. Our results show that
 219 increase of α could result in steady state nodes being further away from pacing
 220 site. Nevertheless, there appears to be a minimum t_{ss} as α is varied in Fig. 7B.

221 3.2.3. Interplay between CV restitution and STM

222 Finally, we aimed to characterize different dynamical behaviors of the spa-
 223 tially coupled mapping model (2.2) at steady state when BCL was changed from
 224 BCL_1 to various BCL_2 . Fig. 8 illustrates steady state responses at different BCL_2
 225 as a function of α for V_2 (shallow CV restitution), $\tau = 11.4\text{ s}$ (A), $\tau = 260\text{ ms}$
 226 (B), $\tau = 200\text{ ms}$ (C) and for V_1 (steep CV restitution), $\tau = 11.4\text{ s}$ (D), $\tau = 260\text{ ms}$
 227 (E), $\tau = 200\text{ ms}$ (F). As observed in Figs. 8A – 8C, at $CV = V_2$, steady state be-
 228 haviors in the cable looked very similar to those of single cell if SDA (cross) and
 229 SCA (square) are considered as alternans, since single cells cannot exhibit spatial
 230 phenomena.

231 Figs. 8A and 8D illustrate that for $\tau = 11.4\text{ s}$, steep CV restitution (V_1 , Fig.
 232 8D) leads to appearance of more complicated dynamical responses, such as CB_2
 233 (diamond) (Fig. 5E), transition from CB_1 to CB_2 (star, $CB_1 \rightarrow CB_2$) (Figs. 5A –
 234 5E) and unstable nodes (plus, unstable) (Fig. 6B).

235 However, Figs. 8B, 8C, 8E, 8F illustrate that for $\tau = 260\text{ ms}$ and 200 ms , the
 236 effect of steep CV restitution curves is negligible, except more formation of SDA,
 237 including the region of large α .

238 Furthermore, Figs. 8D and 8F illustrate that for V_1 , smaller τ (200 ms) leads
 239 to appearance of simpler dynamical responses, such as the inhibition of CB_2 (dia-
 240 mond), transition from CB_1 to CB_2 (star, $CB_1 \rightarrow CB_2$), and unstable nodes (plus,
 241 unstable).

242 Similar to the single cell case, the dynamical behaviors of the cable are differ-
243 ent for high and low values of τ . The cases $\tau = 11.4$ s and $\tau = 200$ ms are two
244 representatives of the respective regimes. We also showed results for $\tau = 260$ ms,
245 at which the behavior is intermediate between the two regimes.

246 Our results indicate that shallow CV restitution together with large τ can help
247 suppress SDA. Steep CV restitution coupled with large τ gives rise to CB_2 , the
248 transition from CB_1 to CB_2 and unstable nodes, which are inhibited by either
249 shallow CV or small τ . Steep CV restitution together with small τ can lead to
250 more formation of SDA, including the region of large α . Our result also indicates
251 that STM plays a dominant role in SDA formation.

252 4. Conclusion and Discussion

253 In this manuscript, we investigated the effect of two aspects of STM (α , τ)
254 and their interplay with CV restitution on alternans formation using numerical
255 simulations of a mapping model with two beats of memory. In both single cell
256 and spatially coupled homogeneous cable, the interplay between α and τ affects
257 the dynamical behaviors of the system. For the case of large APD accommodation
258 ($\tau \geq 290$ ms), an increase in α leads to suppression of alternans. However, if APD
259 accommodation is small ($\tau \leq 250$ ms), an increase in α leads to appearance of
260 additional alternans region. On the other hand, the slope of CV restitution does
261 not change the regions of alternans in the cable. However, steep CV restitution
262 leads to more complicated dynamical behaviors of the system. Specifically, SDA
263 instead of SCA are observed. In addition, for steep CV restitution and sufficiently
264 large τ , we observed formations of CB_2 , transition from CB_1 to CB_2 , and unstable
265 nodes.

266 To our knowledge, this is the first use of overpacing in a mapping model with
267 two beats of memory. At the single cell level, the cell may recover from 2:1
268 rhythm back to 1:1 or 2:2 rhythm if the cell is stimulated beyond the beat at which
269 $DI < D_{\min}$. The same can be said of the cable. This indicates the importance of
270 pacing beyond conduction block. In Fox et al. (2003), stimulation was terminated
271 once $DI(x) < D_{\min}$ for any x in the cable. In Fox et al. (2002b), overpacing was
272 adopted using a simple mapping model without memory; APD only depended
273 on the preceding DI, making it relatively simple to implement overpacing. Here,
274 we overpaced the cable in a mapping model with two beats of memory. The
275 dependence of APD on the preceding APD and two preceding DIs gives rise to
276 new difficulties in the continuation of pacing after $DI < D_{\min}$ for any x in the cable.
277 The resolution of this difficulty is a technical contribution of our paper. Our use of
278 continued pacing has allowed us to observe recoveries from CB_1 to 1:1 responses
279 or SDA and transitions from CB_1 to CB_2 that we would not have been able to see
280 otherwise.

281 This is the first study in which a mapping model with two beats of memory
282 has been used to investigate SDA formation. Over the last decades, the study of
283 SDA has become a major focus of research because of its potentially crucial link
284 to cardiac instability. Our numerical results are in agreement with previous exper-
285 imental and theoretical studies of SDA. We confirmed that SDA can be observed
286 in a homogeneous cable Watanabe et al. (2001); Qu et al. (2000), and that steep
287 CV restitution facilitates SDA Franz (2003); Watanabe et al. (2001); Fenton et al.
288 (2002); Fox et al. (2002b); Taggart et al. (2003). We also found that small τ , to-
289 gether with steep CV restitution, further facilitates SDA formation. This agrees
290 with the experimental results in Mironov et al. (2008) which states that stable

291 SDA nodal lines were associated with steep CV restitution and small τ . Finally,
 292 we demonstrated that unstable behaviors of nodes is related to steep CV restitution
 293 and large τ . This is consistent with experimental results in Mironov et al. (2008),
 294 wherein the unstable drifting behaviors of nodal lines during adaptation to change
 295 in BCL are seen for large values of τ .

296 One limitation of our study is that we chose $D_{\min} = 2$ ms. However, our simu-
 297 lation results demonstrate that sufficiently large increases in D_{\min} might affect the
 298 dynamic behaviors of the cable model. Specifically, for $D_{\min} = 20$ ms, $\tau = 11.4$ s
 299 and $CV = V_1$ (steep CV restitution), we observed more incidences of CB_1 as well
 300 as transitions from SCA or SDA to CB_2 , the latter of which were not present for
 301 $D_{\min} = 2$ ms.

302 Another limitation of our study is that we chose the cable length L to be 4 cm
 303 with 401 cells. It is clear that we will see more incidences of SDA and nodes in
 304 a larger domain. However, if simulations are performed on a larger domain with
 305 length $L > 4$ cm, but the dynamical behaviors are only tracked on the first 4 cm
 306 segment of the simulation domain, we have checked that the simulation results are
 307 similar to the case when $L = 4$ cm. This indicates that the boundary conditions at
 308 $x = L$ do not appreciably affect the results of the simulation.

309 **5. Appendix: Derivation of ξ and ω .**

310 Numerical solutions to Eq. (2.1) together with Eq. (2.3) develops unphysi-
 311 cal spatial discontinuities along the cable, as observed in Echebarria and Karma
 312 (2002). This can be avoided by considering the cell coupling effect, which con-
 313 tributes diffusion and advection terms, as has been suggested in Echebarria and
 314 Karma (2002, 2007). Therefore, in order to model a one dimensional cable, we

315 adopted a spatially coupled mapping model (2.2) by adding diffusion and advec-
 316 tion terms to Eq. (1.1), as suggested in Fox et al. (2003).

317 Here, we discuss the values for ξ and ω that were used in Eq. (2.2) following
 318 Fox et al. (2003). An interpretation of ξ and ω can be found in Echebarria and
 319 Karma (2007). The starting point is the following equation:

$$A_{n+1}(x) = (G * f)(x) = \int_{-\infty}^{+\infty} G(y)f[D_n(x-y)]dy. \quad (5.1)$$

320 where $G(y)$ is some normalized asymmetrical kernel that expresses the diffusive
 321 coupling between neighboring cells. Let us define the Fourier transform ($\mathcal{F}(\cdot)$)
 322 of the kernel to be $(\mathcal{F}(G))(k) = \int_{-\infty}^{+\infty} G(y)e^{-iky}dy$. The exponential function in
 323 the above equation can be expanded in the form $e^{-iky} = 1 - iky - (ky)^2/2 + \dots$. It
 324 then follows that

$$(\mathcal{F}(G))(k) = 1 - i\hat{\omega}k - \hat{\xi}^2k^2 + \dots, \quad (5.2)$$

where the coefficients are defined as

$$\hat{\omega} = \int_{-\infty}^{+\infty} G(y)ydy, \quad \hat{\xi}^2 = \frac{1}{2} \int_{-\infty}^{+\infty} G(y)y^2dy.$$

325 Now, consider the equation

$$(I - \xi^2\nabla^2 + \omega\nabla)A_{n+1} = f(D_n). \quad (5.3)$$

326 This is the same as Eq. (2.2) except that the mapping model f only depends on
 327 D_n . Let us relate ξ and ω above with $\hat{\xi}$ and $\hat{\omega}$ of Eq. (5.2). By taking Fourier
 328 transform of both sides, we have

$$\mathcal{F}(A_{n+1}) = \frac{1}{1 + i\omega k + \xi^2k^2} \mathcal{F}(f). \quad (5.4)$$

329 Therefore,

$$A_{n+1}(x) = (G * f)(x), \text{ where } (\mathcal{F}(G))(k) = \frac{1}{1 + i\omega k + \xi^2k^2}. \quad (5.5)$$

By Taylor expansion, we see that

$$(\mathcal{F}(G))(k) = 1 - i\omega k - (\xi^2 + \omega^2)k^2 + \dots$$

Comparing the above with Eq. (5.2), we have

$$\widehat{\omega} = \omega, \quad \widehat{\xi}^2 = \xi^2 + \omega^2.$$

330 If $\omega^2 \ll \xi^2$, then $\widehat{\xi}^2 = \xi^2$. Therefore, $G = \mathcal{F}^{-1}\left(\frac{1}{1+i\omega k+\xi^2 k^2}\right)$. We point out that
 331 Eq. (5.1) (or a discretized version thereof) has been used in several other publica-
 332 tions to describe electronic couplings between cells. For example, the papers Fox
 333 et al. (2002b) and Vinet (2000) used the Gaussian kernel $G(y) = \exp(-\mu y^2)$.

Note that Eq. (5.1) is an approximation. It is more realistic to use a biophysical ionic model, and it is thus of interest to relate Eq. (5.1) to ionic models. For a simple two variable ionic model, Echebarria and Karma (2007) demonstrated that $\widehat{\omega}$ and $\widehat{\xi}$ can be calculated explicitly in certain limiting cases, giving

$$\widehat{\omega} = \frac{2D}{c}, \quad \widehat{\xi} = (D \times \text{APD}_c)^{1/2},$$

334 where D denotes the diffusion coefficient in the two variable ionic model, c de-
 335 notes CV of a propagating wave and APD_c denotes APD at the bifurcation point.
 336 Using typical values of D , c and APD_c , the length $\widehat{\xi}$ is on the order of 1 mm, while
 337 $\widehat{\omega}$ is on the order 0.1 mm.

338 The authors of Fox et al. (2003) adjusted the value of $\omega (= \widehat{\omega})$ to 0.35 mm in
 339 order to produce spatial patterns that were similar to what they observed experi-
 340 mentally. We also investigated the effect of changing ω on dynamic behaviors of
 341 spatially coupled mapping model, and determined that it has a minor effect. For
 342 instance, $\omega = 0.1$ mm leads to simpler dynamic behaviors. Therefore, we used
 343 $\xi = 1$ mm and $\omega = 0.35$ mm in our manuscript, without loss of generality.

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416 **8. Figure Captions**

417 Fig. 1 : CV as a function of D_n , for steep restitution curves V_1 (solid) and
 418 shallow V_2 (dashed).

419 Fig. 2 : Periodic pacing of single cell leading to 1:1 responses (A). Overpacing
 420 of single cell (B) and cable (C). In A, action potentials occur as a result of periodic
 421 stimulation, i.e., $A_n + D_n = \text{BCL}$. In B, action potentials are shown for pacing
 422 protocol in which BCL was changed from BCL_1 to BCL_2 . Note that, $(n-1)^{\text{th}}$ and
 423 n^{th} stimuli produce action potentials, but the $(n+1)^{\text{th}}$ stimulus (dashed vertical
 424 line) fails to produce an action potential. However, if the $(n+2)^{\text{th}}$ beat produces
 425 an action potential, then D_{n+1} and A_{n+2} can be obtained by Eq. (2.5). In C, solid
 426 and dashed lines represent the wavefront and waveback of an action potential,
 427 respectively. The $(n-1)^{\text{th}}$ and n^{th} stimuli produce action potentials that propagate
 428 to the end of the cable. But the $(n+1)^{\text{th}}$ action potential can only be delivered
 429 for $x < x^*$, i.e. CB occurs at $x = x^*$. Note that, the $(n+2)^{\text{th}}$ action potential can
 430 propagate to the end of the cable.

431 Fig. 3 : CB (A) and overpacing leading to transition from 2:1 to 1:1 in single
 432 cell (B). APD (open circle) is displayed versus stimulus number at BCL_2 when
 433 BCL was changed from $\text{BCL}_1 = 500$ ms to $\text{BCL}_2 = 170$ ms. Here, $\alpha = 0.1$ (A),
 434 $\alpha = 0.6$ (B) and $\tau = 11.4$ s. Dashed lines represent $A_1^{\text{thr}} = \text{BCL}_2 - D_{\text{min}}$ and
 435 $A_2^{\text{thr}} = 2\text{BCL}_2 - D_{\text{min}}$.

436 Fig. 4 : Dynamic responses of single cell at steady state as a function of
 437 α when BCL was decreased from BCL_1 to different BCL_2 for $\tau = 11.4$ s (A),
 438 $\tau = 260$ ms (B), and $\tau = 200$ ms (C). Behaviors are classified as 1:1 (filled circles
 439 or upper right corner regions labeled as 1:1), 2:2 (or alternans) (crosses) and CB.

440 Fig. 5 : Effect of overpacing in cable. Transition from CB_1 (A) to SCA

441 (B) and SDA (C, D) and then to CB_2 (E) as BCL was decreased from BCL_1
 442 to $BCL_2 = 220$ ms. Here, $\alpha = 0.175$, $\tau = 11.4$ s and $CV = V_1$. Transition (F)
 443 from CB_1 to SDA and then to 1:1 response as BCL was decreased from BCL_1 to
 444 $BCL_2 = 190$ ms. Here $\alpha = 0.425$, $\tau = 11.4$ s and $CV = V_1$.

445 Fig. 6 : Stable (A) and unstable (B) SDA nodal behaviors. APD of selective
 446 beats are displayed versus cable length when BCL was decreased from BCL_1
 447 to $BCL_2 = 240$ ms (A) and $BCL_2 = 210$ ms (B), $\alpha = 0.175$ (A), $\alpha = 0.3$ (B),
 448 $\tau = 11.4$ s and $CV = V_1$ (steep CV restitution).

449 Fig. 7 : X_{ss} and t_{ss} as a function of α for stable nodes when BCL was decreased
 450 from BCL_1 to $BCL_2 = 130$ ms, $\tau = 200$ ms and $CV = V_1$ (steep CV restitution).

451 Fig. 8 : Dynamical responses of the cable at steady state as a function of α
 452 when BCL was changed from BCL_1 to different BCL_2 for $CV = V_2$, $\tau = 11.4$ s
 453 (A), $\tau = 260$ ms (B) and $\tau = 200$ ms (C); $CV = V_1$, $\tau = 11.4$ s (D), $\tau = 260$ ms
 454 (E), $\tau = 200$ ms (F). Behaviors were classified as 1:1 response (filled circle or
 455 upper right corner regions labeled as 1:1), SDA (cross), SCA (square), CB_1 , CB_2
 456 (diamond), transition from CB_1 to CB_2 (star, $CB_1 \rightarrow CB_2$) and unstable nodes
 457 (plus, unstable).

458 9. Figures

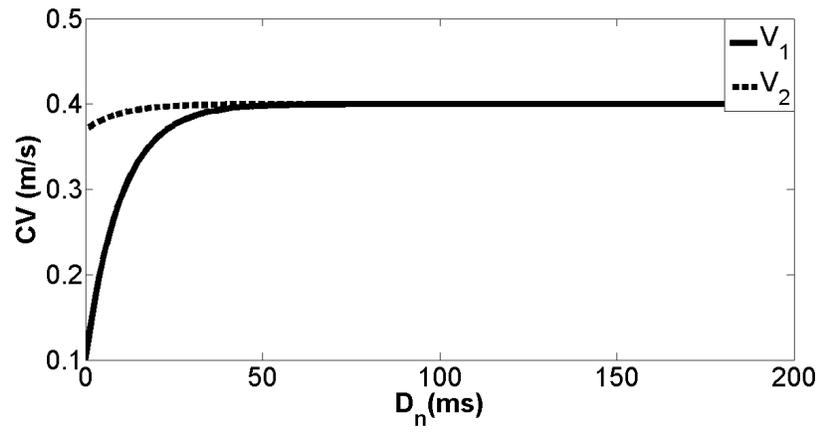
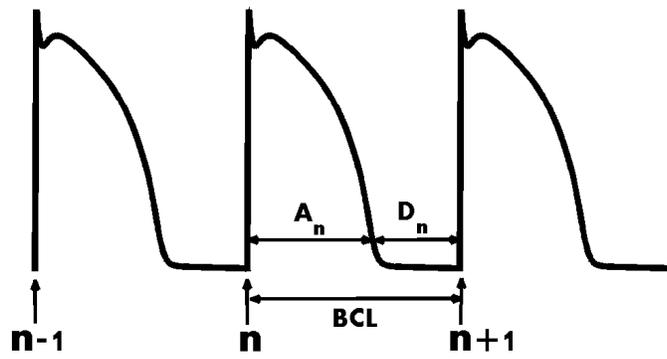
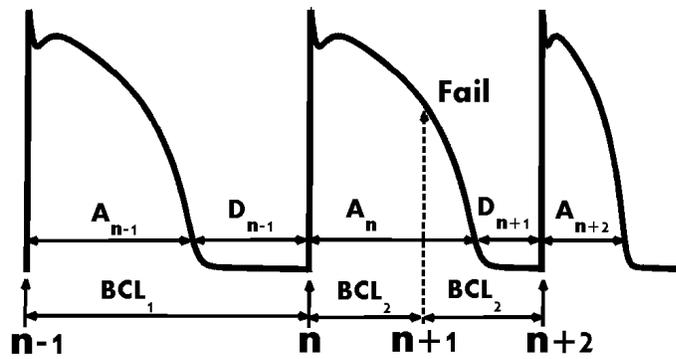


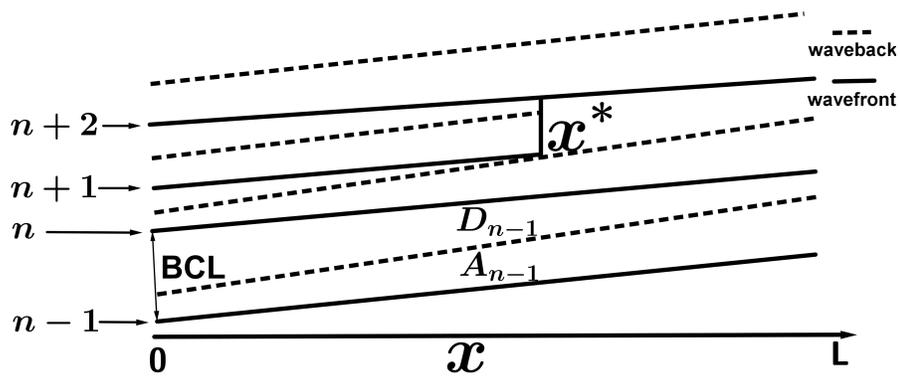
Figure 1



A

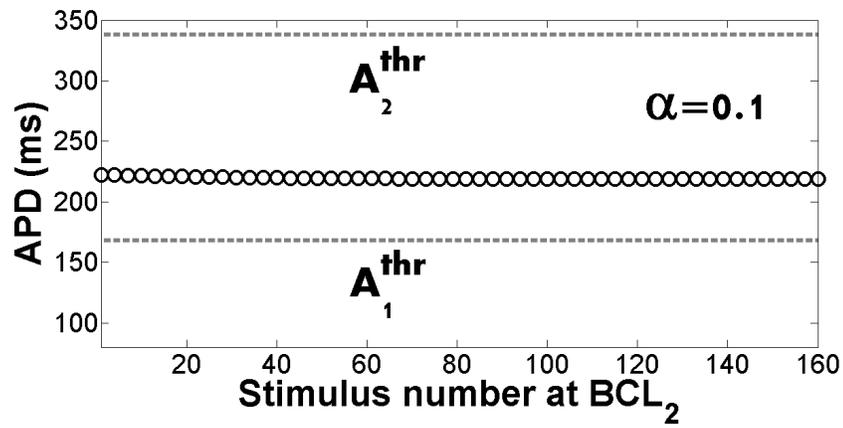


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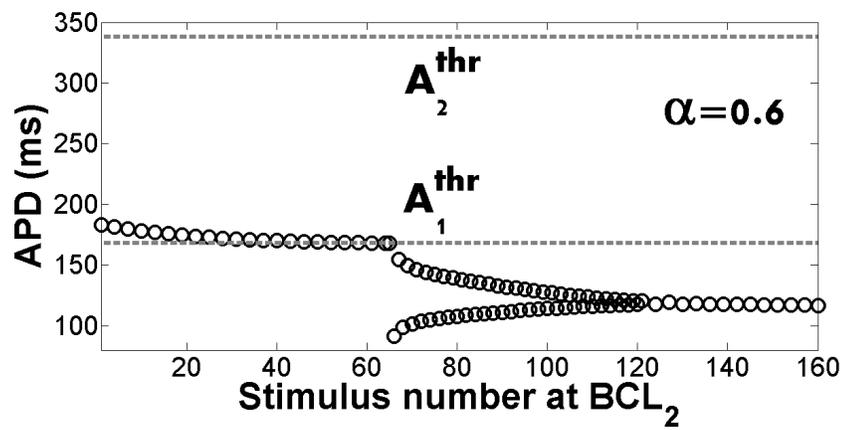


C

Figure 2

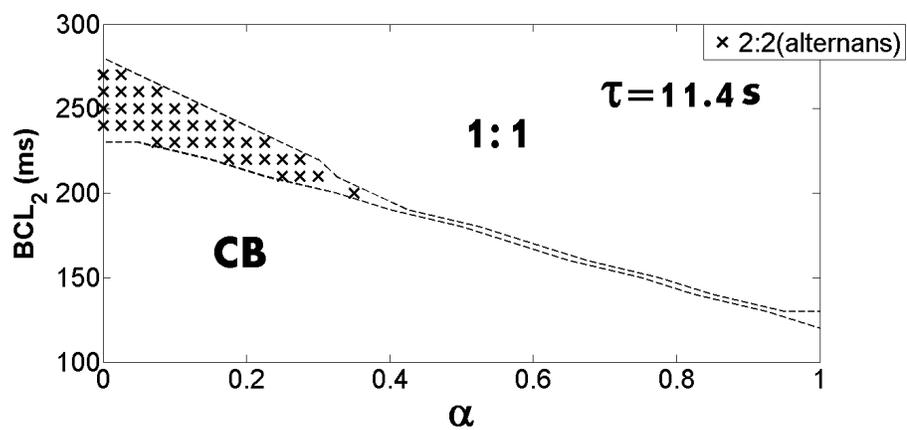


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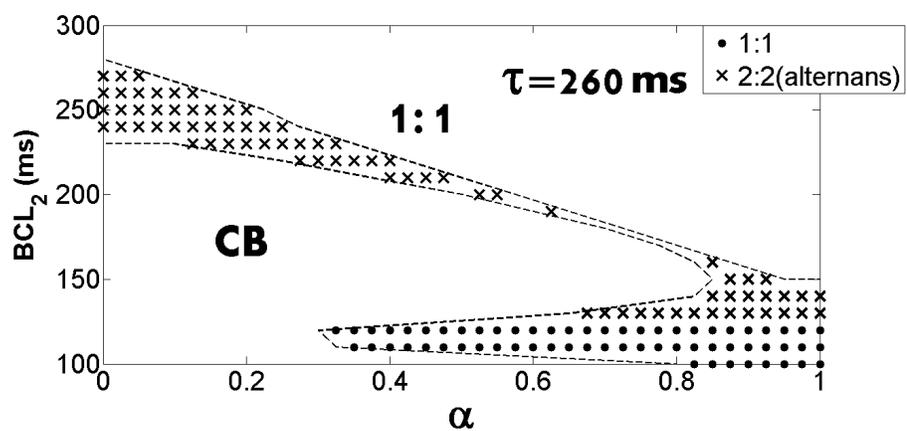


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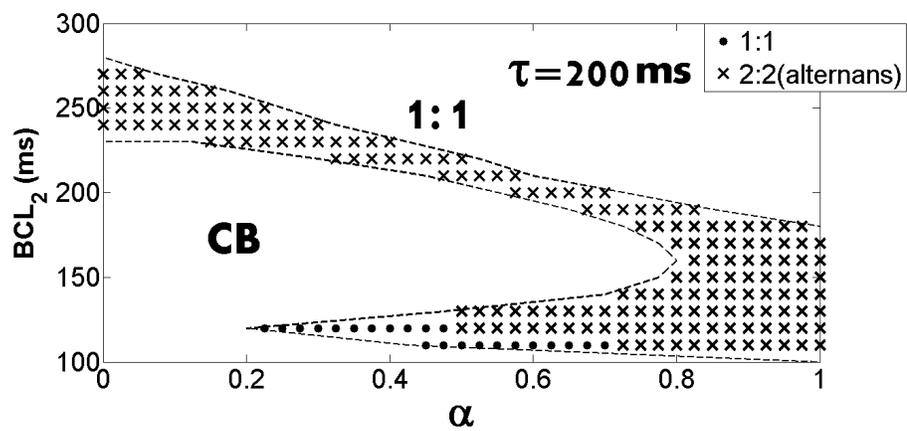
Figure 3



A



B



C

Figure 4

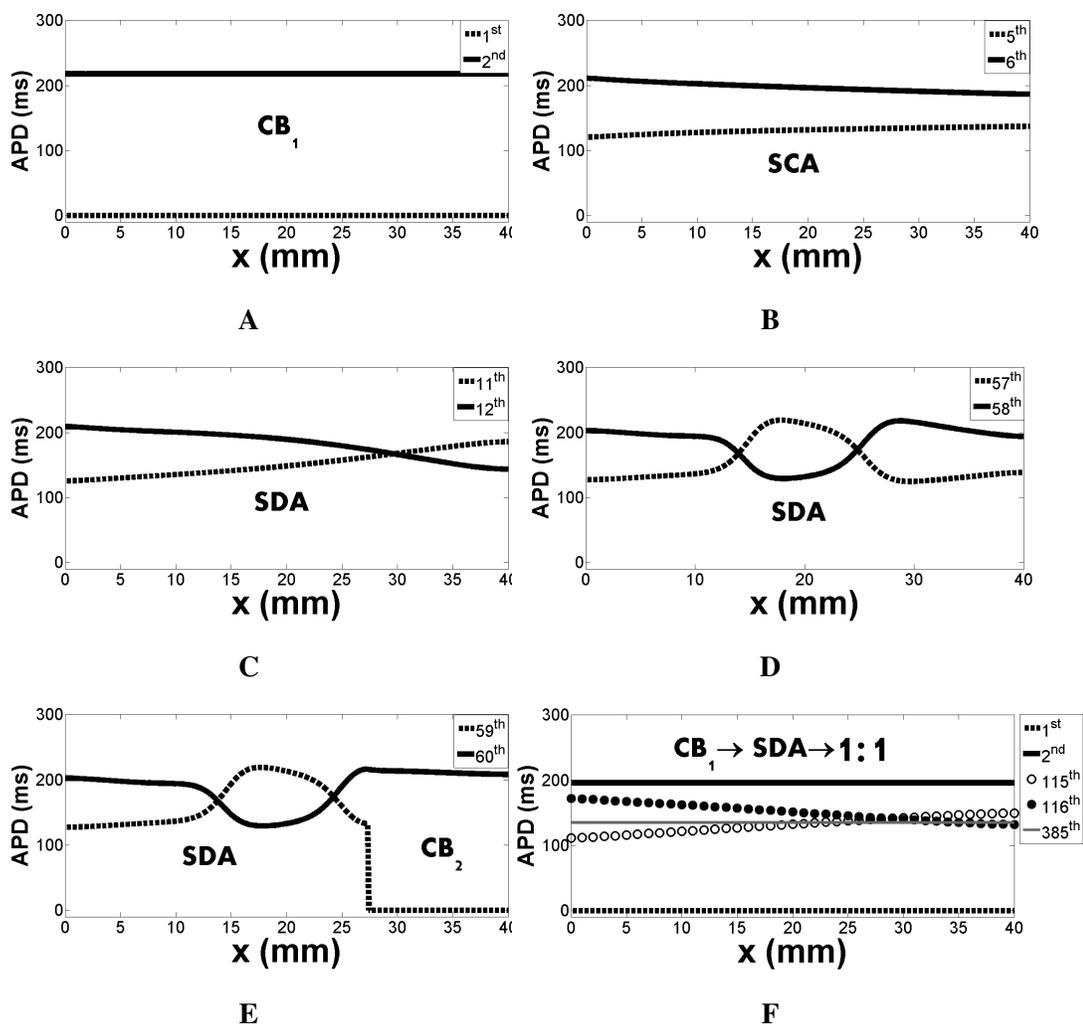
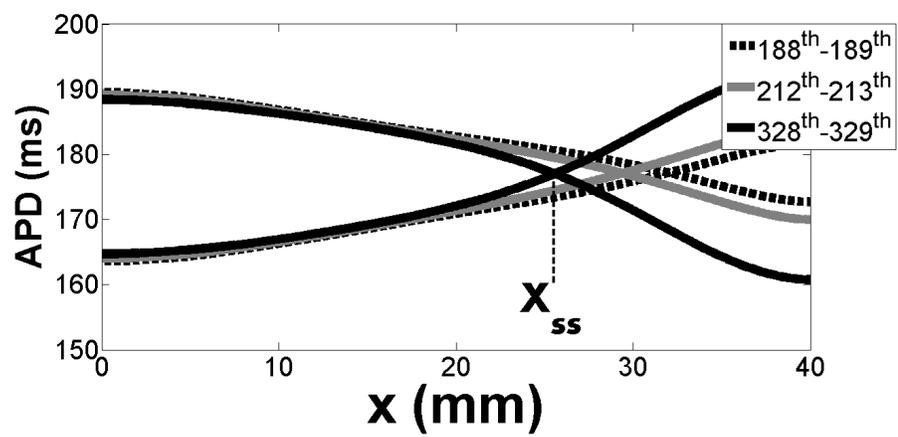
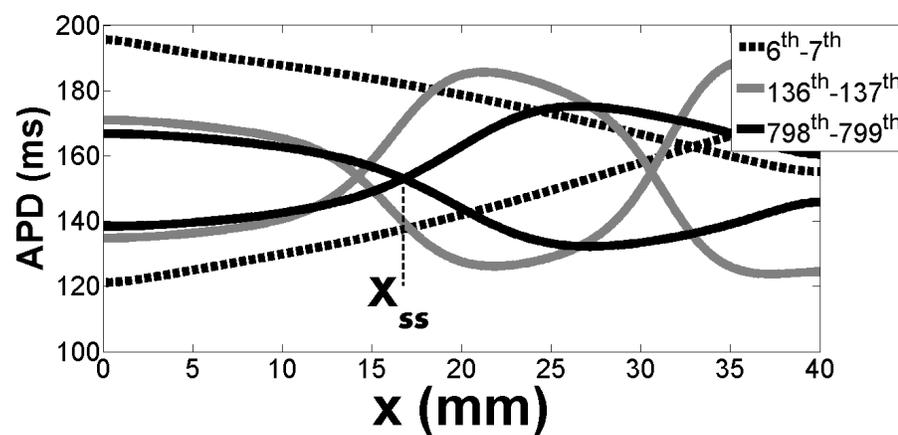


Figure 5

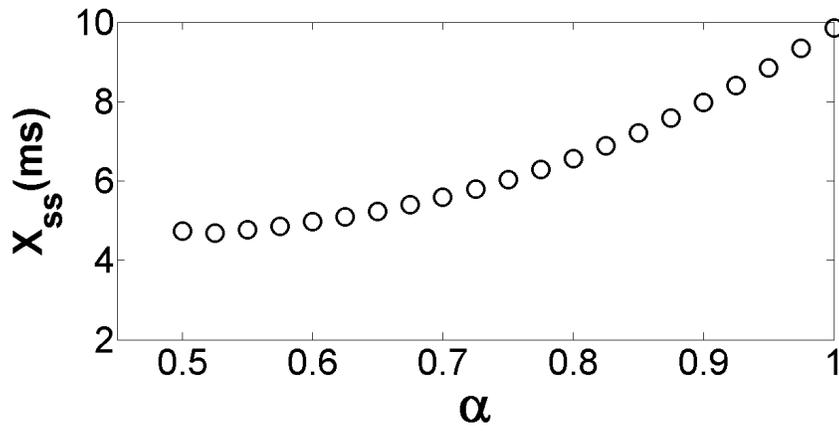


A

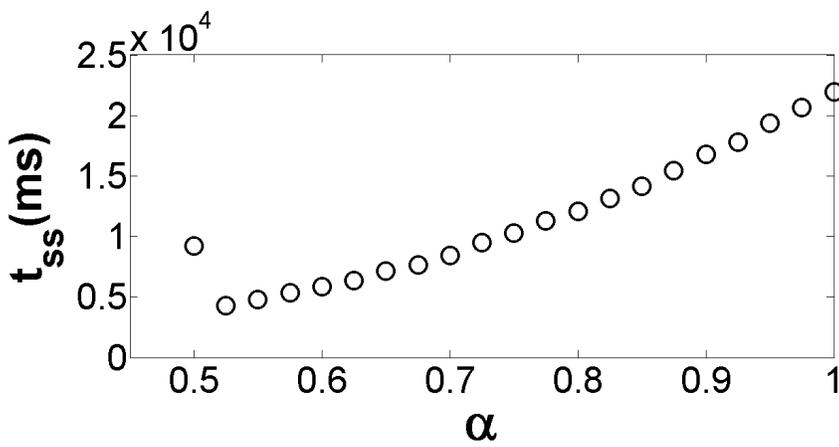


B

Figure 6

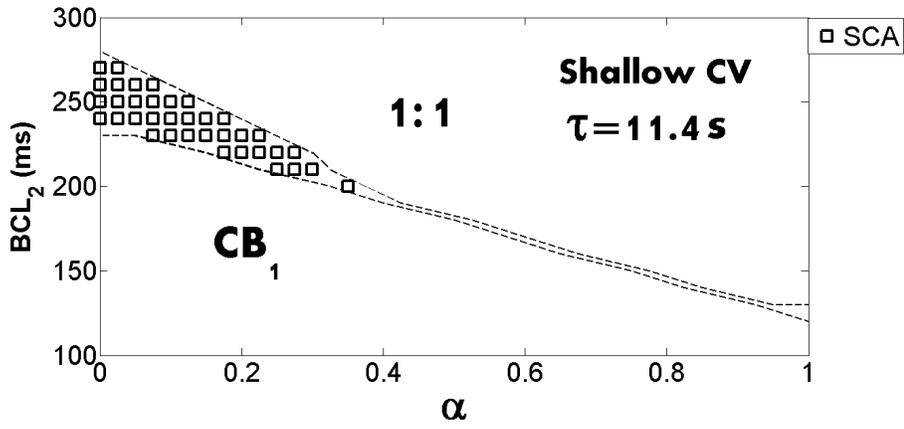


A

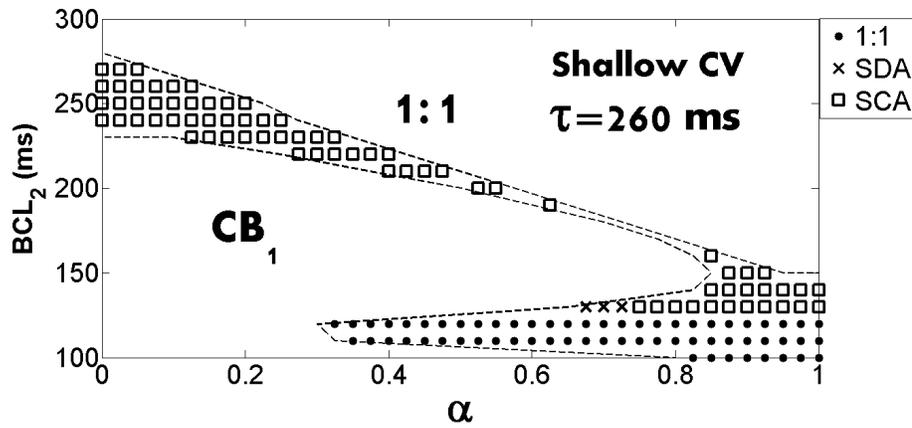


B

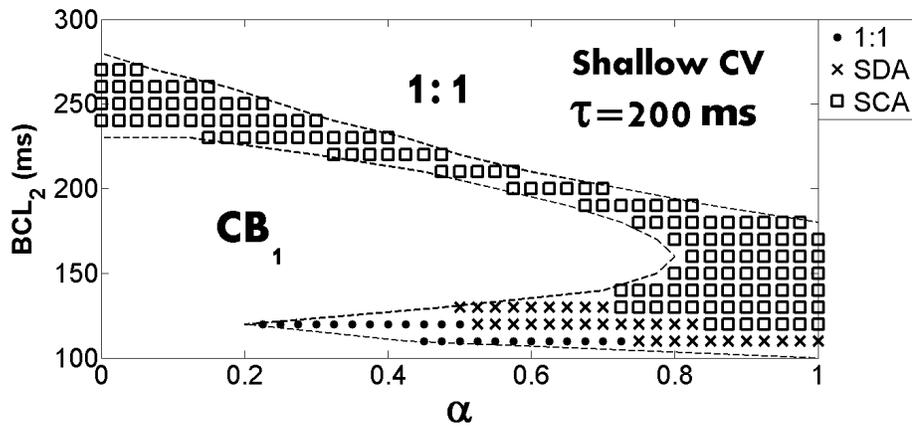
Figure 7



A



B



C

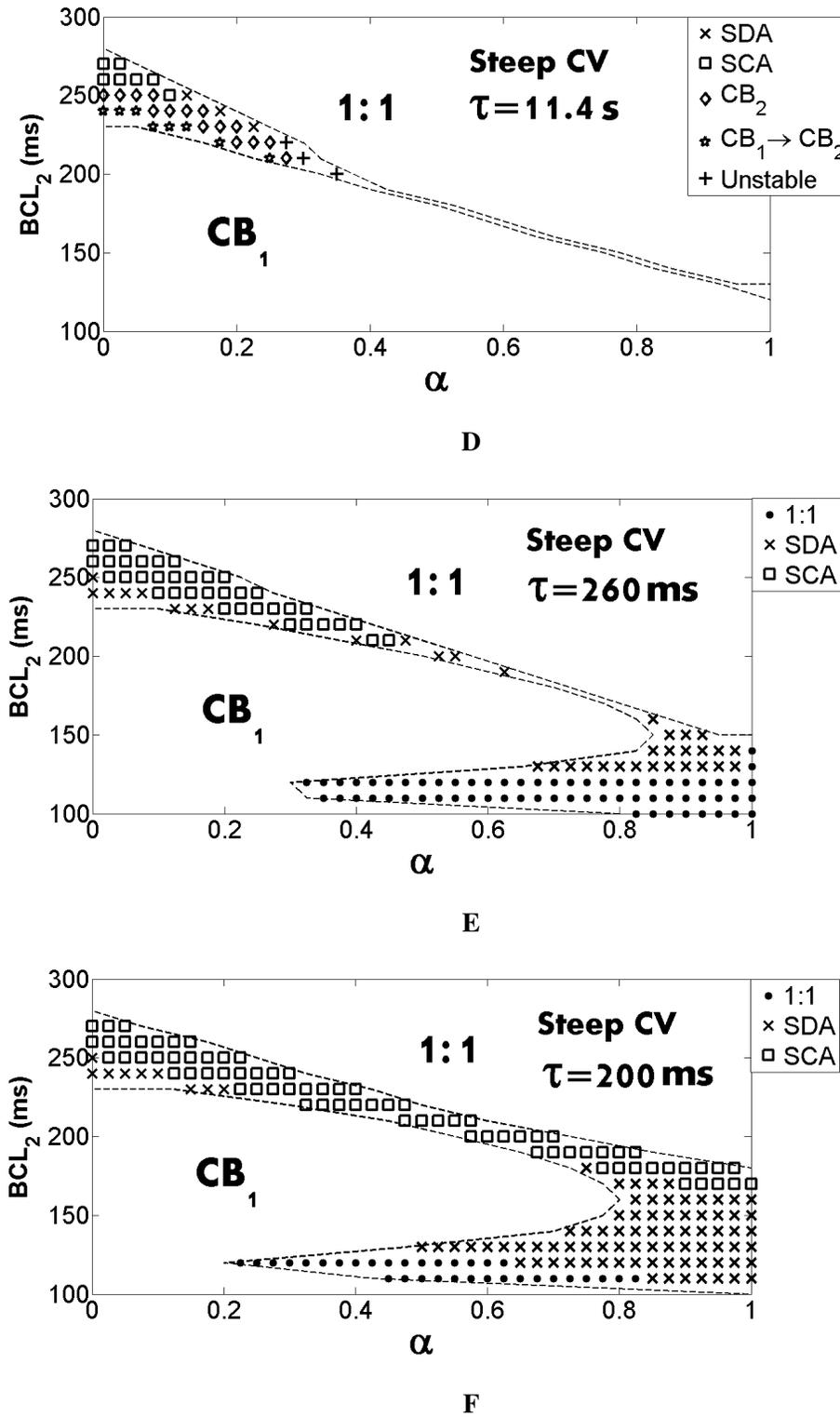


Figure 8

459 **10. Tables****Table 1:** Parameters Abbreviations

Parameter	Meaning	Value
D_{\min}	minimum DI for which action potential can be initiated.	2 ms
BCL_1	Initial BCL in the pacing protocol.	500 ms
BCL_2	Second BCL in the jump pacing protocol.	100 ms to 300 ms
X_{ss}	Steady state positions of nodes in the cable.	
t_{ss}	Time to steady state of the nodes in the cable.	
A_1^{thr}	Threshold for APD without overpacing.	$A_1^{\text{thr}} = BCL_2 - D_{\min}$.
A_2^{thr}	Threshold for APD including overpacing.	$A_2^{\text{thr}} = 2BCL_2 - D_{\min}$.
CB	Conduction block in the single cell or cable.	
CB_1	Type I conduction block in the cable. (Block occurs at $x = 0$).	
CB_2	Type II conduction block in the cable. (Block occurs at $x \neq 0$).	
V_1	Steep CV restitution curve.	$V_1 = 0.4 - 0.3\exp(-DI/10)$.
V_2	Shallow CV restitution curve.	$V_2 = 0.4 - 0.03\exp(-DI/10)$.
x	Position in the cable.	
L	Length of the cable.	4 cm