

# **Left ventricular activation-recovery interval variability predicts spontaneous ventricular tachyarrhythmia in heart failure patients.**

**Short Title:** ARI variability and ventricular tachyarrhythmia

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1 **ABSTRACT**

2

3 **Background:** Enhanced beat-to-beat variability of repolarization (BVR) is strongly linked to  
4 arrhythmogenesis and is largely due to variation in ventricular action potential duration  
5 (APD). Previous studies in humans have relied on QT interval measurements; however, a  
6 direct relationship between beat-to-beat variability of APD and arrhythmogenesis in humans  
7 has yet to be demonstrated.

8 **Objectives:** This study aimed to explore the beat-to-beat repolarization dynamics within a  
9 heart failure population at the level of ventricular APD.

10 **Methods:** 43 patients with heart failure and implanted cardiac resynchronization therapy  
11 defibrillator devices were studied. Activation-recovery intervals (ARI) as a surrogate for  
12 APD were recorded from the left ventricular epicardial lead while pacing from the right  
13 ventricular lead to maintain constant cycle length.

14 **Results:** During mean follow-up of  $23.6\pm 13.6$  months, 11 patients sustained VT/VF and  
15 received appropriate implantable cardioverter-defibrillator therapies (Anti-Tachycardia  
16 Pacing or shock therapy). ARI variability (ARIV) was significantly greater in patients with  
17 subsequent VT/VF vs. those without VT/VF ( $3.55\pm 1.3$  ms vs.  $2.77\pm 1.09$  ms,  $p=0.047$ ).  
18 Receiver operating characteristic curve analysis (AUC 0.71,  $p=0.046$ ) suggested high and  
19 low risk ARIV groups for VT/VF. The Kaplan–Meier survival analysis demonstrated that the  
20 time until first appropriate therapy for VT/VF was significantly shorter in the high-risk ARIV  
21 group ( $p=0.028$ ). ARIV was a predictor for VT/VF in the multivariate Cox model (HR,  
22 1.623; 95% CI, 1.1 to 2.393;  $p=0.015$ ).

23 **Conclusions:** Increased left ventricular ARIV is associated with an increased risk of VT/VF  
24 in patients with heart failure.

25

- 26 **Key words:** ventricular arrhythmia, activation-recovery interval, beat-to-beat variability,  
27 intracardiac electrogram, cardiac resynchronization therapy defibrillator

28 **INTRODUCTION**

29

30 Accurate prediction of individuals at risk of ventricular arrhythmia (VA) and sudden cardiac  
31 death remains a major challenge.<sup>1</sup> Exaggerated beat-to-beat variability (BBV) of  
32 repolarization (BVR) is known to be associated with arrhythmogenesis in animal models<sup>2-5</sup>  
33 and humans<sup>6-11</sup> and has been proposed as a potential risk marker.

34

35 The activation-recovery interval (ARI) is well validated.<sup>12-14</sup> In vivo it can be obtained from  
36 pacing leads in ambulatory patients, invasively during electrophysiology studies, and more  
37 recently has been derived from non-invasive cardiac electrophysiology mapping techniques.<sup>15</sup>  
38 As such it is readily available for the assessment of ventricular repolarization and therefor a  
39 potential adjunct in the prediction of patients at risk of VA. Recent animal studies have  
40 demonstrated significant increases in the BBV of ARI prior to the onset of Torsades de  
41 pointes and have highlighted its potential for integration into implantable cardiac devices to  
42 monitor arrhythmia risk.<sup>16</sup>

43

44 In the present study, we have recorded left ventricular (LV) unipolar electrograms (UEGs),  
45 while pacing from the right ventricular (RV) lead to maintain a constant cycle length in  
46 patients with heart failure. From these electrograms we have calculated ARI variability  
47 (ARIV). We hypothesized that higher baseline ARIV would be seen in patients experiencing  
48 VA during follow-up.

49

50 **METHODS**

51

52 **Ethical Approval**

53 The study was approved by the local research ethics committee and conformed to the  
54 Declaration of Helsinki (latest revision: 64<sup>th</sup> WMA General Assembly) standard. Informed  
55 consent was obtained in writing from all subjects.

56

57 **Study population and data acquisition**

58 We retrospectively analyzed the prospectively collected data of 43 consecutive patients who  
59 underwent electrogram recordings to study basic ARI within a heart failure population. The  
60 study enrolled patients with St. Jude Medical cardiac resynchronization therapy defibrillator  
61 (CRT-D) devices for primary or secondary indications of sudden cardiac death (SCD).

62 Patients of either sex, >18 years of age and undergoing CRT-D follow-up at our institution  
63 were eligible. During a routine follow-up visit LV UEG recordings were made via the device  
64 programmer (Merlin, St. Jude Medical Inc., St Paul, MN). Effects of heart rate variability on  
65 repolarization dynamics were removed by establishing fixed cycle length with steady-state  
66 pacing (DDD-RV for sinus rhythm or VVI-RV for atrial fibrillation).<sup>17</sup> A constant rate of 10  
67 beats above the patient's intrinsic heart rate was chosen with a minimum adaptation period of  
68 2 minutes.<sup>18</sup> A 30 second recording of LV UEG was made using the device programmer at a  
69 sampling frequency of 512 Hz and extracted for off-line analysis.<sup>19,20</sup> **Figure 1** shows  
70 examples of raw digital UEGs. Occurrence of VA therapy with either ATP or shock therapy  
71 was assessed by CRT-D checks and served as the endpoint. Programming of the CRT-D  
72 device was based on clinical evaluation of the attending electrophysiologist. CRT-D  
73 interrogation data of recorded events was evaluated by an electrophysiologist blinded to the  
74 outcome of the LV UEG data.

75

## 76 Repolarization variability analysis

77 Raw digital LV UEG traces were analysed off-line using custom built MATLAB software  
78 (MathWorks Inc, Mass). Recordings were separately low pass filtered at both 80 and 30 Hz  
79 for calculation of activation times (ATs) and repolarization times (RTs), respectively. The  
80 choice of two separate frequencies for AT and RT calculation allowed us to maintain the  
81 sharp activation gradients required to identify ATs, whilst also successfully preserving the  
82 morphology of the slower T-wave to identify RTs. Consecutive ARIs were calculated by  
83 identifying AT and RT for each beat using the Wyatt method.<sup>13,14,19,21,22</sup> Automated  
84 identification of ATs and RTs removed any observer variability. **Figure 1** shows examples of  
85 the identification of ATs and RTs and the resultant ARI across various morphologies of  
86 UEG. ARIV over the full 30s recording was then computed as.

$$87 \quad ARIV = \frac{\sum_{i=1}^{n_{beats}-1} |ARI_{i+1} - ARI_i|}{(\sqrt{2} \times n_{beats})}$$

88 where n beats is the number of beats contained within the 30s period.<sup>23</sup> To account for the  
89 possibility that the magnitude of beat-to-beat changes may depend on the intrinsic ARI  
90 duration we introduced the ARIV index. The ARIV index provides a normalized value of the  
91 ARIV relative to the mean ARI duration for each patient. The ARIV index was computed as.

$$92 \quad ARIV \text{ index} = \frac{1}{ARI_{mean}} \times \frac{\sum_{i=1}^{n_{beats}-1} |ARI_{i+1} - ARI_i|}{(\sqrt{2} \times n_{beats})} \quad \text{where} \quad ARI_{mean} = \frac{\sum_{i=1}^{n_{beats}} ARI_i}{n_{beats}}$$

93

94

95

## 96 Statistical Analysis

97 Results are presented as mean±standard deviation for normally distributed variables and as  
98 median and interquartile range (IQR) for non-normally distributed variables. The  
99 independent-samples t-test was used to compare normally distributed continuous variables;

100 otherwise the Mann-Whitney U test was used. Categorical variables were compared using  
101 Fisher's exact test. ROC analysis was performed using Youden's index to determine the  
102 variable cut-off levels with optimal sensitivity and specificity for the endpoint. The estimated  
103 cutoff values were retrospectively used to reclassify and dichotomize the study subjects into  
104 high and low-risk categories. Kaplan-Meier survival analysis was used to address our  
105 hypothesis testing the association between increased ARIV and probability of first  
106 appropriate defibrillator therapy for VT/VF. Cox proportional hazards analyses were  
107 performed separately for each variable of interest (Mean ARI, ARIV and ARIV index). A *P*  
108 value of <0.05 was considered to be statistically significant for all tests. All statistical  
109 analyses were performed using SPSS (IBM Switzerland, Switzerland) and Prism (GraphPad  
110 Software Inc., California, USA).

111

112 **RESULTS**

113

114 **Data eligibility**

115 A total of 43 ambulatory heart failure patients underwent UEG recordings. Of these, 6  
116 patients were excluded from the ARIV analysis: 2 due to a >15% ectopy burden during  
117 recordings, 3 due to significant electrogram fractionation (**Figure 2A**), 1 due to absence of a  
118 well-defined T-wave such that no positive gradient could be identified during repolarization  
119 (**Figure 2B**). ARIV analysis was performed in the remaining 37 patients. T-wave  
120 morphology remained constant and there were no AV conducted beats throughout the  
121 recordings. The median RV pacing rate used during LV UEG recordings was 85 bpm (IQR,  
122 80 to 95). As expected, significant correlation was seen between the pacing rate and mean  
123 ARI ( $r=-0.725$ ,  $p<0.001$ ). However, there was no correlation between mean ARI and ARIV  
124 ( $r=0.045$ ,  $p=0.792$ ), nor the pacing rate and ARIV ( $r=-0.150$ ,  $p=0.377$ ).

125

126 **Study population**

127 Of those eligible for ARIV analysis (**Table 1**), 30 were men (81.1%) and 7 women (18.9%)  
128 who had undergone CRT-D implantation for primary (29 patients, 78.4%) or secondary (8  
129 patients, 21.6%) prevention of SCD. The patients were enrolled in the study in median time  
130 6.9 months after CRT-D implantation (range, 5.3 to 31.9 months). At the time of data  
131 acquisition, no patients had decompensated heart failure. All patients had electrolytes within  
132 ranges unexpected to disturb repolarization prior to UEG recordings (sodium  $138.1\pm 3.2$   
133 mEq/L, potassium  $4.7\pm 0.5$  mEq/L). During follow-up no patients were initiated on class I or  
134 III antiarrhythmic agents, nor underwent coronary intervention/VT ablation prior to meeting  
135 the study endpoint or before conclusion of study follow-up.

136



137 Comparing patients with ischemic and non-ischemic cardiomyopathy, there was no  
138 difference in mean ARI ( $257.69\pm 26.6$  ms vs.  $251.21\pm 35.27$  ms,  $p=0.554$ ), ARIV ( $3.44\pm 1.32$   
139 ms vs.  $2.67\pm 0.98$  ms,  $p=0.055$ ), nor the ARIV index ( $1.37\pm 0.6\%$  vs.  $1.07\pm 0.36\%$ ,  $p=0.115$ ).  
140 LV ejection fraction (LVEF) showed no correlation with mean ARI ( $r_s=0.021$ ,  $p=0.901$ ),  
141 ARIV ( $r_s=0.020$ ,  $p=0.907$ ) nor the ARIV index ( $r_s=0.039$ ,  $p=0.818$ ). Between patients with  
142 primary and secondary prevention indications for CRT-D there was no difference in mean  
143 ARI ( $257.34\pm 32.35$  ms vs.  $241.97\pm 26.99$  ms,  $p=0.207$ ). Differences in ARIV approached  
144 significance ( $2.83\pm 1.21$  ms vs.  $3.62\pm 0.94$  ms,  $p=0.051$ ), and a significantly higher ARIV  
145 index was seen in the secondary prevention group ( $1.12\pm 0.5\%$  vs.  $1.49\pm 0.34\%$ ,  $p=0.021$ ). 23  
146 of the patients were CRT responders and 14 non-responders (a CRT responder was defined as  
147 a  $\geq 5\%$  improvement in LVEF from pre-implant). Between responders and non-responders  
148 there was no observed difference in mean ARI ( $253.26\pm 35.24$  ms vs.  $255.26\pm 25.61$  ms,  
149  $p=0.865$ ), ARIV ( $2.94\pm 1.14$  ms vs.  $3.11\pm 1.3$  ms,  $p=0.699$ ) nor ARIV index ( $1.18\pm 0.48\%$  vs.  
150  $1.23\pm 0.53\%$ ,  $p=0.817$ ).

151

### 152 **Implantable cardioverter-defibrillator therapy**

153 Following LV UEG recordings a mean follow-up of  $23.6\pm 13.6$  months took place. During  
154 follow-up 11 patients of 37 reached the endpoint of appropriate ICD therapy for VT/VF. ATP  
155 was attempted and successful in 9 patients with VT. One patient with VT had successful  
156 rescue shock therapy. One patient experienced VF with successful shock therapy. One patient  
157 died from heart failure before reaching the endpoint. **Table 1** shows a comparison of clinical  
158 characteristic of patients with and without subsequent appropriate ICD therapy for VT/VF.

159

160 ARIV was significantly greater in patients with subsequent VT/VF events vs. those without  
161 VT/VF events ( $3.55\pm 1.3$  ms vs.  $2.77\pm 1.09$  ms,  $p=0.047$ ). The ARIV index was also

162 significantly greater in patients with subsequent VT/VF events vs. those without VT/VF  
163 events ( $1.43\pm 0.5\%$  vs.  $1.1\pm 0.47\%$ ,  $p=0.036$ ). No observed difference between groups was  
164 found in mean ARI ( $249.34\pm 27.91\%$  vs.  $256\pm 33.31\%$ ,  $p=0.618$ ). Receiver operating  
165 characteristic (ROC) curve analysis (**Figure 3**) suggested cut-off levels for ARIV of  $\geq 2.52$   
166 ms with 82% sensitivity (95% CI, 48-98%) and 58% specificity (95% CI, 37-77%) (AUC  
167 0.71; 95% CI, 0.53-0.89;  $p=0.046$ ) and ARIV index of  $\geq 1.14\%$  with 64% sensitivity (95% CI,  
168 31-89%) and 65% specificity (95% CI, 44-83%) (AUC 0.72; 95% CI, 0.55-0.9;  $p=0.036$ ) to  
169 dichotomize into high/low risk for the endpoint of appropriate ICD therapy.

170

171 **Table 2** shows the clinical characteristics of patients with ARIV dichotomized at high and  
172 low risk of VT/VF. When comparing subjects in the high-risk group for ARIV, 45%  
173 experienced an episode of VT/VF by 3 years, compared with 11.8% in the low-risk group.

174 **Figure 4A** demonstrates the separation of the Kaplan-Meier curves at the variable cut-off for  
175 ARIV (Mantel-Cox log-rank test,  $p=0.028$ ). When comparing subjects in the high-risk group  
176 for ARIV index, 43.8% experienced an episode of VT/VF by 3 years, compared with 19.0%  
177 in the low-risk group. **Figure 4B** demonstrates the separation of the Kaplan-Meier curves at  
178 the variable cut-off for ARIV index (Mantel-Cox log-rank test,  $p=0.079$ ).

179

180 Mean ARI, ARIV and the ARIV index were tested separately in the multivariate Cox  
181 proportional-hazards regression model for all VT/VF events, with the significant clinical  
182 covariate LVEF. Low LVEF remained a significant predictor of appropriate ICD therapy for  
183 VT/VF in all models tested. Mean ARI was not predictive (HR, 0.997; 95% CI, 0.977-1.017;  
184  $p=0.758$ ). ARIV (HR, 1.623; 95% CI, 1.1-2.393;  $p=0.015$ ) and the ARIV index (HR, 3.256;  
185 95% CI, 1.222-8.676;  $p=0.018$ ) were independent predictors of VT/VF (**Figure 5**). After  
186 exclusion of patients with secondary indications for ICD therapy both ARIV (HR, 1.518;

187 95% CI, 1.009-2.285;  $p=0.045$ ) and the ARIV index (HR, 2.87; 95% CI, 1.033-7.975;  
188  $p=0.043$ ) remained independent predictors of VT/VF. After exclusion of patients on  
189 amiodarone both ARIV (HR, 1.625; 95% CI, 1.114-2.371;  $p=0.012$ ) and the ARIV index  
190 (HR, 3.259; 95% CI, 1.262-8.411;  $p=0.015$ ) remained independent predictors of VT/VF.  
191

192 **DISCUSSION**

193

194 To our knowledge, this is the first study to demonstrate an association between VA risk and  
195 increased LV BVR. The main findings were: 1) increased ARIV was associated with an  
196 independent risk for VT/VF; 2) increased ARIV index (ARIV normalized to mean ARI)  
197 remained an independent predictor for VT/VF; 3) there was no association between mean  
198 ARI and VT/VF risk.

199

200 **Relation to prior work on repolarization variability**

201 The potential for stratification of individuals at risk of VA by means of repolarization  
202 instability has been demonstrated with QT intervals from the surface ECG and RV  
203 intracardiac electrograms.<sup>6-11</sup> Our findings of higher values of BBV of ARI in heart failure  
204 patients experiencing VT/VF extends these observations to the level of the ventricular APD  
205 and to the assessment of LV BVR. The ROC analysis found ARIV to be more sensitive than  
206 the ARIV index in the prediction of ICD therapies. This was highlighted again in the Kaplan-  
207 Meier analysis showing less separation in the curves for ARIV index when compared to  
208 ARIV. These results would suggest that use of BBV of ARI to assess risk of VT/VF is more  
209 reliable without adjustment for basic ARI.

210

211 A major component of QTV is heart rate variability and both the QT interval and APD are  
212 strongly cycle length dependent<sup>24,25</sup>. As the majority of QTV studies occurred in the absence  
213 of controlled cycle length it is technically challenging to separate heart rate driven QTV from  
214 actual fluctuations in the QT interval. RV pacing to obtain cycle length control as employed  
215 in our study removes the component of BVR due to heart rate variability.

216

217 It is accepted that the QT interval in a given ECG lead measures the interval between the  
218 earliest depolarization and latest repolarization as projected onto the axis of that lead.<sup>26</sup> Given  
219 its spatial heterogeneity the use of multi-lead ECG recordings to assess QTV has been  
220 suggested but warrants further investigation.<sup>26</sup> The in vivo dispersion of ARIV and  
221 correlations to various body surface ECG repolarization indices should be studied and could  
222 be invaluable in our understanding of both QTV and ARIV.

223

#### 224 **Relation to prior work on basic APD and QT interval measurements**

225 In the present study, basic ARI in heart failure patients was not predictive of VT/VF events.  
226 This is consistent with several studies reporting QT variability as a stronger predictor of  
227 arrhythmia than QT prolongation.<sup>2,3,5,7,8</sup> These findings pointing to instability of  
228 repolarization as a key factor would be in keeping with a cellular mechanism such as  
229 proposed by Johnson et al<sup>27</sup>, who also observed dissociation between APD variability and  
230 basic APD under certain conditions.

231

232 Shortening of basic APD occurs in responders to CRT, whilst lengthening of basic APD  
233 occurs in non-responders.<sup>20</sup> In vivo electrical remodelling in heart failure at the level of  
234 BBV-APD needs to be studied prospectively and may offer insight into the impact of CRT on  
235 VAs.

236

#### 237 **Mechanisms of beat-to-beat variability of repolarization**

238 Several mechanisms have been proposed for the cellular basis of BBV-APD. Its apparently  
239 random nature suggests the involvement of a stochastic process. Stochastic variation of fast  
240 sodium current ( $I_{Na}$ ), L-type calcium current ( $I_{CaL}$ ), transient outward current ( $I_{To}$ ), rapid  
241 delayed rectifier ( $I_{Kr}$ ) and slow delayed rectifier ( $I_{Ks}$ ) potassium currents has been shown to

242 influence BBV-APD<sup>23,28,29</sup> with considerable interdependence between individual channels.<sup>23</sup>  
243 Spontaneous calcium release from the sarcoplasmic reticulum exhibits BBV and in the  
244 presence of calcium overload has been shown experimentally and in silico to generate BBV-  
245 APD.<sup>27</sup> This mechanism was due to spontaneous calcium release from the sarcoplasmic  
246 reticulum in late diastole reducing the subsequent calcium transient and hence reducing  $I_{CaL}$   
247 deactivation and prolonging the APD. However, the extent to which these effects seen in  
248 isolated cells may be operative in the whole heart where cells are well coupled is uncertain  
249 due to electrotonic interaction between cells.<sup>30</sup> Nevertheless under conditions of calcium  
250 overload or reduced repolarization reserve, the effect of stochasticity on channel behavior  
251 may be enhanced suggesting that these effects may become operative in pathological  
252 conditions. BBV-APD may be arrhythmogenic either by the development of early or delayed  
253 afterdepolarizations<sup>27</sup> or by enhanced dispersion of repolarization facilitating re-entry.

254

### 255 **Clinical implications and future work**

256 Risk stratification of patients at high risk of sudden cardiac death remains a major challenge.  
257 In view of the multiple mechanisms involved it is unlikely that a single test would prove  
258 sufficient and that a combination of clinical characteristics with a selection of stratification  
259 tools may be more appropriate.<sup>31</sup> In this context, our study builds on the body of evidence  
260 highlighting the potential for assessment of baseline BVR to form part of the risk  
261 stratification tool.

262

263 Wijers et al<sup>16</sup> have highlighted the significance of the temporal behavior of ARI prior to the  
264 onset of VA in dogs. Furthermore, this work demonstrated comparable short-term variability  
265 of ARI between RV and LV. The potential for automated continuous real-time monitoring of  
266 ARIV offers a novel future application for ICDs. However, the optimal recording location is

267 unknown and further work is needed to compare ARIV across multiple simultaneous  
268 recording sites within the heart. Paroxysmal atrial arrhythmias may result in variable  
269 ventricular filling in BiV paced patients and as such their influence on the ventricular ARI  
270 within a CRT population should be studied.

271

## 272 **Limitations**

273 The study population was relatively small and as a single tertiary centre study the patient  
274 group may not be representative of the usual CRT-D population. These results should be  
275 validated in a larger multicenter prospective study of a primary prevention ICD indication  
276 cohort. As ischemia testing was not conducted as part of the protocol we are unable to  
277 determine the influence of ischemia on BBV of ARI. Our observations are confined to a  
278 single LV epicardial site. Regional variation of the electrophysiological properties throughout  
279 the ventricular myocardium makes it possible that other regions may have demonstrated  
280 differing results. Short and long-term variation in ARIV should be studied in order to  
281 determine the optimal duration and frequency of recordings for its use as a predictor of VA.<sup>32</sup>  
282 Whilst strategies to analyze fractionated electrograms have been proposed,<sup>33</sup> a clear  
283 consensus in their interpretation does not exist. In the context of the assessment of BVR this  
284 could prove a challenge. Furthermore, the presence of a high ectopy burden or the lack of a  
285 gradient to define repolarization time could exclude some patients altogether. In our study  
286 14.0% of patients were excluded due to these limitations thus highlighting an area for future  
287 work.

288

## 289 **Conclusion**

290 In patients with heart failure, increased ARIV is associated with increased risk of  
291 spontaneous VT/VF. These results accord with observations in QTV and extend observations

292 to assessment of left ventricular BVR and specifically to the level of ventricular APD. Our  
293 findings are supportive of the possible utility of BVR as an adjunct to risk stratification of  
294 patients at risk of ventricular arrhythmia.

295

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## 302 REFERENCES

- 303 1. Køber L, Thune JJ, Nielsen JC, et al.: Defibrillator Implantation in Patients with  
304 Nonischemic Systolic Heart Failure. *N Engl J Med* Massachusetts Medical Society,  
305 2016; 375:1221–1230.
- 306 2. Thomsen MB, Verduyn SC, Stengl M, Beekman JDM, de Pater G, van Opstal J,  
307 Volders PGA, Vos MA: Increased short-term variability of repolarization predicts d-  
308 sotalol-induced torsades de pointes in dogs. *Circulation* American Heart Association,  
309 Inc, 2004; 110:2453–2459.
- 310 3. Gallacher DJ, Van de Water A, van der Linde H, Hermans AN, Lu HR, Towart R,  
311 Volders PGA: In vivo mechanisms precipitating torsades de pointes in a canine model  
312 of drug-induced long-QT1 syndrome. *Cardiovasc Res* 2007; 76:247–256.
- 313 4. Abi-Gerges N, Valentin J-P, Pollard CE: Dog left ventricular midmyocardial myocytes  
314 for assessment of drug-induced delayed repolarization: short-term variability and  
315 proarrhythmic potential. *Br J Pharmacol* Blackwell Publishing Ltd, 2010; 159:77–92.
- 316 5. Jacobson I, Carlsson L, Duker G: Beat-by-beat QT interval variability, but not QT  
317 prolongation per se, predicts drug-induced torsades de pointes in the anaesthetised  
318 methoxamine-sensitized rabbit. *J Pharmacol Toxicol Methods* 2011; 63:40–46.
- 319 6. Atiga WL, Calkins H, Lawrence JH, Tomaselli GF, Smith JM, Berger RD: Beat-to-  
320 beat repolarization lability identifies patients at risk for sudden cardiac death. *J*  
321 *Cardiovasc Electrophysiol* 1998; 9:899–908.
- 322 7. Haigney MC, Zareba W, Gentlesk PJ, Goldstein RE, Illovsky M, McNitt S, Andrews  
323 ML, Moss AJ, Multicenter Automatic Defibrillator Implantation Trial II investigators:  
324 QT interval variability and spontaneous ventricular tachycardia or fibrillation in the  
325 Multicenter Automatic Defibrillator Implantation Trial (MADIT) II patients. *Journal of*  
326 *the American College of Cardiology* 2004; 44:1481–1487.
- 327 8. Hinterseer M, Beckmann B-M, Thomsen MB, et al.: Usefulness of short-term  
328 variability of QT intervals as a predictor for electrical remodeling and proarrhythmia in  
329 patients with nonischemic heart failure. *The American Journal of Cardiology* Elsevier,  
330 2010; 106:216–220.
- 331 9. Oosterhoff P, Tereshchenko LG, van der Heyden MAG, Ghanem RN, Fetcs BJ,  
332 Berger RD, Vos MA: Short-term variability of repolarization predicts ventricular  
333 tachycardia and sudden cardiac death in patients with structural heart disease: a  
334 comparison with QT variability index. *Heart Rhythm* 2011; 8:1584–1590.
- 335 10. Tereshchenko LG, Fetcs BJ, Domitrovich PP, Lindsay BD, Berger RD: Prediction of  
336 ventricular tachyarrhythmias by intracardiac repolarization variability analysis. *Circ*  
337 *Arrhythm Electrophysiol* American Heart Association, Inc, 2009; 2:276–284.
- 338 11. Tereshchenko LG, Ghanem RN, Abeyratne A, Swerdlow CD: Intracardiac QT integral  
339 on far-field ICD electrogram predicts sustained ventricular tachyarrhythmias in ICD  
340 patients. *HRTM* Elsevier Inc, 2011; 8:1889–1894.

- 341 12. Haws CW, Lux RL: Correlation between in vivo transmembrane action potential  
342 durations and activation-recovery intervals from electrograms. Effects of interventions  
343 that alter repolarization time. *Circulation* 1990; 81:281–288.
- 344 13. Coronel R, de Bakker JMT, Wilms-Schopman FJG, Opthof T, Linnenbank AC,  
345 Belterman CN, Janse MJ: Monophasic action potentials and activation recovery  
346 intervals as measures of ventricular action potential duration: experimental evidence to  
347 resolve some controversies. *Heart Rhythm Elsevier*, 2006; 3:1043–1050.
- 348 14. Potse M, Vinet A, Opthof T, Coronel R: Validation of a simple model for the  
349 morphology of the T wave in unipolar electrograms. *Am J Physiol Heart Circ Physiol*  
350 *American Physiological Society*, 2009; 297:H792–H801.
- 351 15. Andrews CM, Srinivasan NT, Rosmini S, Bulluck H, Orini M, Jenkins S, Pantazis A,  
352 McKenna WJ, Moon JC, Lambiase PD, Rudy Y: Electrical and Structural Substrate of  
353 Arrhythmogenic Right Ventricular Cardiomyopathy Determined Using Noninvasive  
354 Electrocardiographic Imaging and Late Gadolinium Magnetic Resonance Imaging.  
355 *Circ Arrhythm Electrophysiol American Heart Association, Inc*, 2017; 10:e005105.
- 356 16. Wijers SC, Sprenkeler DJ, Bossu A, Dunnink A, Beekman JDM, Varkevisser R,  
357 Hernández AA, Meine M, Vos MA: Beat-to-beat variations in activation-recovery  
358 interval derived from the right ventricular electrogram can monitor arrhythmic risk  
359 under anesthetic and awake conditions in the canine chronic atrioventricular block  
360 model. *Heart Rhythm* 2018; 15:442–448.
- 361 17. Bueno-Orovio A, Hanson BM, Gill JS, Taggart P, Rodríguez B: Slow adaptation of  
362 ventricular repolarization as a cause of arrhythmia? *Methods Inf Med Schattauer*  
363 *Publishers*, 2014; 53:320–323.
- 364 18. Franz MR, Swerdlow CD, Liem LB, Schaefer J: Cycle length dependence of human  
365 action potential duration in vivo. Effects of single extrastimuli, sudden sustained rate  
366 acceleration and deceleration, and different steady-state frequencies. *J Clin Invest*  
367 *American Society for Clinical Investigation*, 1988; 82:972–979.
- 368 19. Hanson B, Child N, Van Duijvenboden S, Orini M, Chen Z, Coronel R, Rinaldi CA,  
369 Gill JS, Gill JS, Taggart P: Oscillatory behavior of ventricular action potential duration  
370 in heart failure patients at respiratory rate and low frequency. *Front Physiol Second*  
371 *Edition. Frontiers*, 2014; 5:414.
- 372 20. Chen Z, Hanson B, Sohal M, et al.: Coupling of ventricular action potential duration  
373 and local strain patterns during reverse remodeling in responders and nonresponders to  
374 cardiac resynchronization therapy. *Heart Rhythm Elsevier*, 2016; 13:1898–1904.
- 375 21. Wyatt RF, Burgess MJ, Evans AK, Lux RL, Abildskov JA, Tsutsumi T: Estimation of  
376 ventricular transmembrane action potential durations and repolarization times from  
377 unipolar electrograms. *The American Journal of Cardiology Elsevier*, 1981; 47:488.
- 378 22. Hanson B, Gill J, Western D, Gilbey MP, Bostock J, Boyett MR, Zhang H, Coronel R,  
379 Taggart P: Cyclical modulation of human ventricular repolarization by respiration.  
380 *Front Physiol Frontiers*, 2012; 3:379.

- 381 23. Pueyo E, Dangerfield CE, Britton OJ, Virág L, Kistamás K, Szentandrassy N, Jost N,  
382 Varró A, Nánási PP, Burrage K, Rodríguez B: Experimentally-Based Computational  
383 Investigation into Beat-To-Beat Variability in Ventricular Repolarization and Its  
384 Response to Ionic Current Inhibition. *PLoS ONE Public Library of Science*, 2016;  
385 11:e0151461.
- 386 24. Boyett MR, Jewell BR: A study of the factors responsible for rate-dependent  
387 shortening of the action potential in mammalian ventricular muscle. *J Physiol (Lond)*  
388 Wiley-Blackwell, 1978; 285:359–380.
- 389 25. Zaza A, Malfatto G, Schwartz PJ: Sympathetic modulation of the relation between  
390 ventricular repolarization and cycle length. *Circ Res* 1991; 68:1191–1203.
- 391 26. Baumert M, Porta A, Vos MA, Malik M, Couderc J-P, Laguna P, Piccirillo G, Smith  
392 GL, Tereshchenko LG, Volders PGA: QT interval variability in body surface ECG:  
393 measurement, physiological basis, and clinical value: position statement and consensus  
394 guidance endorsed by the European Heart Rhythm Association jointly with the ESC  
395 Working Group on Cardiac Cellular Electrophysiology. *Europace* 2016; 18:925–944.
- 396 27. Johnson DM, Heijman J, Bode EF, Greensmith DJ, van der Linde H, Abi-Gerges N,  
397 Eisner DA, Trafford AW, Volders PGA: Diastolic spontaneous calcium release from  
398 the sarcoplasmic reticulum increases beat-to-beat variability of repolarization in canine  
399 ventricular myocytes after  $\beta$ -adrenergic stimulation. *Circ Res American Heart*  
400 *Association, Inc*, 2013; 112:246–256.
- 401 28. Tanskanen AJ, Greenstein JL, O'Rourke B, Winslow RL: The role of stochastic and  
402 modal gating of cardiac L-type  $\text{Ca}^{2+}$  channels on early after-depolarizations. *Biophys*  
403 *J Elsevier*, 2005; 88:85–95.
- 404 29. Heijman J, Zaza A, Johnson DM, Rudy Y, Peeters RLM, Volders PGA, Westra RL:  
405 Determinants of beat-to-beat variability of repolarization duration in the canine  
406 ventricular myocyte: a computational analysis. *PLoS Comput Biol Public Library of*  
407 *Science*, 2013; 9:e1003202.
- 408 30. Zaniboni M, Pollard AE, Yang L, Spitzer KW: Beat-to-beat repolarization variability  
409 in ventricular myocytes and its suppression by electrical coupling. *Am J Physiol Heart*  
410 *Circ Physiol* 2000; 278:H677–H687.
- 411 31. Dagnes N, Hindricks G: Risk stratification after myocardial infarction: is left  
412 ventricular ejection fraction enough to prevent sudden cardiac death? *Eur Heart J*  
413 2013; 34:1964–1971.
- 414 32. Guduru A, Lansdown J, Chernichenko D, Berger RD, Tereshchenko LG: Longitudinal  
415 changes in intracardiac repolarization lability in patients with implantable cardioverter-  
416 defibrillator. *Front Physiol Frontiers*, 2013; 4:208.
- 417 33. Ellis WS, Eisenberg SJ, Auslander DM, Dae MW, Zakhor A, Lesh MD:  
418 Deconvolution: a novel signal processing approach for determining activation time  
419 from fractionated electrograms and detecting infarcted tissue. *Circulation* 1996;  
420 94:2633–2640.

421

422 **Table 1.** Baseline characteristics of patients with and without subsequent appropriate ICD  
 423 therapy for VT/VF. NYHA, New York Heart Association.

<b>Variables</b>	<b>No VT/VF event (n=26)</b>	<b>VT/VF events at follow-up (n=11)</b>	<b>P value</b>
Age (IQR), years	68 (63-77)	63 (52-66.5)	0.059
Male, n (%)	19 (73.1)	11 (100)	0.080
Ischemic cardiomyopathy, n (%)	12 (46.2)	4 (36.4)	0.723
Ejection fraction $\pm$ SD, %	38.9 $\pm$ 11.7	26 $\pm$ 11.2	<b>0.004</b>
NYHA class $\geq$ 2, n (%)	16 (61.5)	9 (81.8)	0.279
Secondary prevention ICD, n (%)	6 (23.1)	2 (18.2)	1
Diabetes mellitus, n (%)	8 (30.8)	4 (36.4)	1
Hypertension, n (%)	8 (30.8)	5 (45.5)	0.465
Atrial fibrillation, n (%)	6 (23.1)	4 (36.4)	0.442
Beta-blockade, n (%)	21 (80.8)	11 (100)	0.295
ACE inhibitor, n (%)	24 (92.3)	11 (100)	1
Aldosterone antagonists, n (%)	15 (57.7)	4 (36.4)	0.295
Digoxin, n (%)	4 (15.4)	3 (27.3)	0.403
Amiodarone, n (%)	3 (11.5)	0 (0)	0.540
Biventricular pacing percentage (IQR), %	99 (97-99)	98 (94-99)	0.377
Pacing rate for EGM recording (IQR), bpm	80 (80-95)	90 (82.5-92.5)	0.780

424

425 **Table 2.** Clinical characteristics of patients with ARIV dichotomized as per ROC suggested  
 426 optimal cut-off values. NYHA, New York Heart Association.

Variables	ARIV low-risk (n=17)	ARIV high-risk (n=20)	P value
Age (IQR), years	68 (62-76)	66 (56-75)	0.279
Male, n (%)	12 (70.6)	18 (90)	0.212
Ischemic cardiomyopathy, n (%)	5 (29.4)	11 (55)	0.185
Ejection fraction $\pm$ SD, %	35.5 $\pm$ 13.6	34.8 $\pm$ 12.5	0.857
NYHA class $\geq$ 2, n (%)	10 (58.8)	15 (75)	0.482
Secondary prevention ICD, n (%)	1 (5.9)	7 (35)	<b>0.048</b>
Diabetes mellitus, n (%)	7 (41.2)	5 (25)	0.482
Hypertension, n (%)	2 (11.8)	11 (55)	<b>0.014</b>
Atrial fibrillation, n (%)	6 (35.3)	4 (20)	0.460
Beta-blockade, n (%)	14 (82.4)	18 (90)	0.644
ACE inhibitor, n (%)	16 (94.1)	19 (95)	1
Aldosterone antagonists, n (%)	11 (64.7)	8 (40)	0.191
Digoxin, n (%)	5 (29.4)	2 (10)	0.212
Amiodarone, n (%)	0 (0)	3 (15)	0.234
Biventricular pacing percentage $\pm$ SD, %	99 (98-99)	98 (94-99)	0.368
Pacing rate for EGM recording $\pm$ SD, bpm	90 (80-100)	80 (80-90)	0.148

427

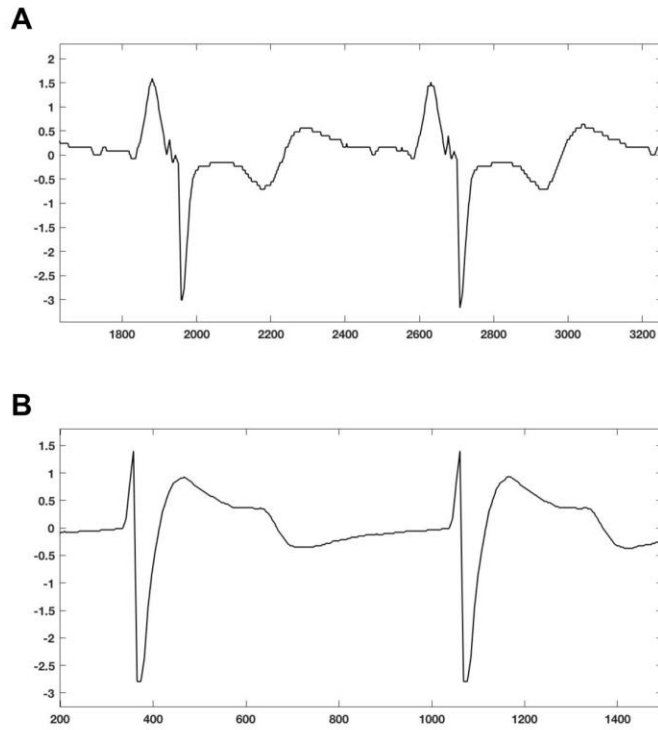
428 **Figure 1.** Unipolar electrograms recorded from the left ventricular lead of 3 separate patients  
429 demonstrating local activation (star) and repolarization (square).



430

431 **Figure 2.** Two pitfalls of ARIV analysis: **(A)** fractionation, **(B)** neutral gradient during  
432 repolarization.

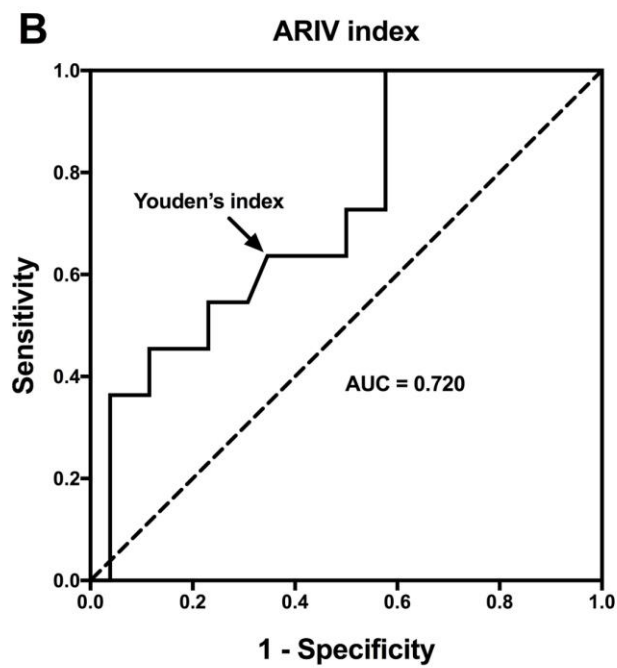
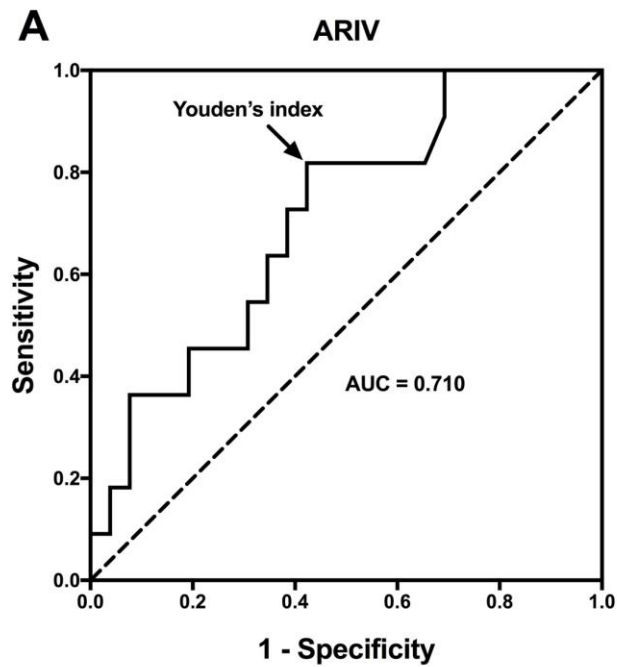
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435 **Figure 3.** Receiver operating characteristic analysis for (A) ARIV and (B) ARIV index to  
436 predict VT/VF. Optimal cut-off levels determined by Youden's index.

437



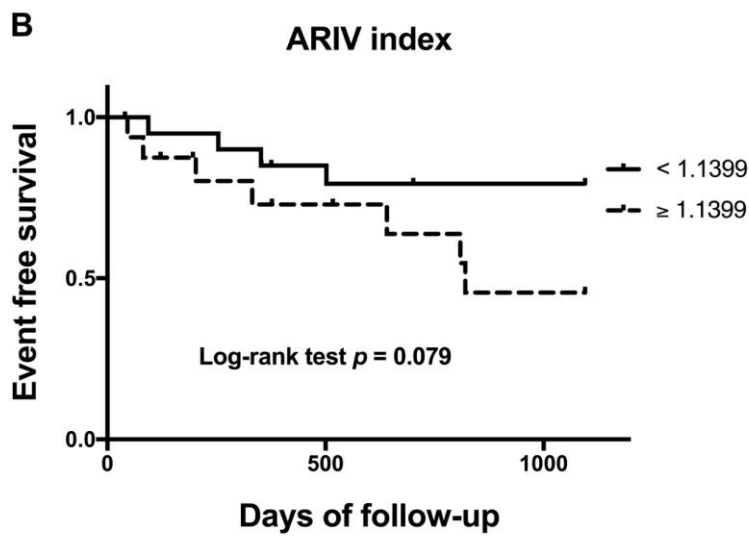
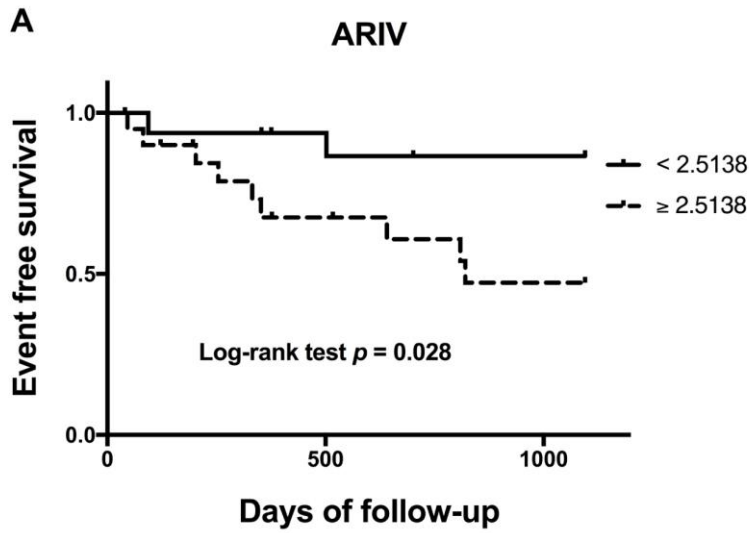
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439

440 **Figure 4.** Kaplan-Meier curves for freedom from VT/VF events in patients dichotomized by

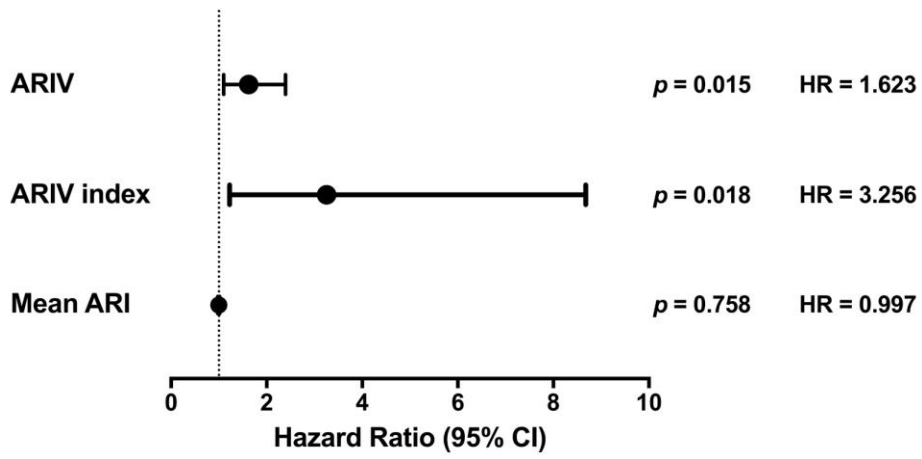
441 ROC derived optimal cut-off values for (A) ARIV and (B) ARIV index.



442

443 **Figure 5.** Hazard ratios (adjusted for LVEF) for the association of mean ARI, ARIV and  
444 ARIV index with appropriate ICD therapy for VT/VF.

445



446

447