

# Assessment of the Effect of Fibrillatory Waves in the Analysis of Spatial Heterogeneity of Ventricular Repolarization

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## Abstract

*In providing proper treatment for Atrial Fibrillation (AF) patients, the clinician must establish the pattern of arrhythmia, determine associated symptoms, and asses for underlying comorbidities in order to define short- and long-term management strategies. To do so, this paper describes a preliminary study in which a novel ECG-based estimator of the standard deviation of ventricular myocytes' repolarization times ( $s_g$ ) called the  $\mathcal{V}$ -index was computed in simulated data, assessing whether the presence of f-waves may corrupt the  $\mathcal{V}$ -index. The analysis was performed in simulated ECGs generated by combining synthetic bundles of 300 T-waves with seven different values of  $s_g$  with QRS template and 50 f-waves extracted from real data. The results show a strong correlation between the calculated target  $\mathcal{V}$ -index ( $t\mathcal{V}$ -index) and the  $s_g$  ( $r = 0.99$ ,  $p$ -value  $< 0.001$ ). They also show the effect of the f-waves in the computation of the  $\mathcal{V}$ -index. The  $\mathcal{V}$ -index calculated with f-waves ( $f\mathcal{V}$ -index) and after the f-waves were removed ( $c\mathcal{V}$ -index) had highly significant differences ( $p$ -value  $< 0.001$ ) and significant differences ( $p$ -value  $< 0.05$ ) with the  $t\mathcal{V}$ -index for values below 53.3 ms, which proves the corruptive effect the f-waves have on the computation of the  $\mathcal{V}$ -index and stresses the importance of removing them before attempting further analysis.*

## 1. Introduction

The progressive aging of the general population is associated with an inevitable rising in incidence of atrial fibrillation (AF) [1], which is associated to increased mortality. Even if AF is an atrial arrhythmia, it has been shown to cause ventricular repolarization remodelling [2], and to be an independent contributor to sudden cardiac death risk [3].

Several parameters related to T-wave morphology (width [4], amplitude) and duration ( $T_{apex} - T_{end}$  [5, 6] and QT dispersion [7]) have been proposed to quantify the heterogeneity of ventricular repolarization. However,

when applied, they showed limitations [8, 9], have been questioned [10] or provided controversial interpretations [9, 11, 12]. Other parameters such as the one proposed by Martín-Yabra et al. focuses on the differences between pairs of T-waves when analysing AF patients under Sinus Rhythm (SR) conditions, but the index used was tailored for chronic heart failure patients only and not tested during AF conditions [13]. Having this in mind, a novel method to quantify the dispersion of myocytes' repolarization times, rooted on van Oosterom's biophysical model [14] of the ECG was derived [15]. The  $\mathcal{V}$ -index is an electrocardiogram (ECG)-based estimator of the standard deviation of ventricular myocytes' repolarization times  $s_g$ . The spatial dispersion of ventricular repolarization is responsible for the genesis of the T-wave on the ECG and an amplification of the heterogeneity favours the development of ventricular tachycardia/fibrillation as it creates suitable conditions for re-entry mechanisms [16, 17].

Up to now, studies involving the  $\mathcal{V}$ -index have been focused on patients with symptoms suggestive of non-ST-elevation myocardial infarction [18], assessing the effect of drugs such as moxifloxacin or sotalol [19] and studying the survival rate in patients with Chagas disease [20]. During AF the T-waves may be corrupted by f-waves, typical of AF. Thus, when applying the  $\mathcal{V}$ -index to ECG during AF, the contribution of f-waves should be considered. This paper describes a preliminary study in which the  $\mathcal{V}$ -index is computed on simulated data, assessing the effect of f-waves on the  $\mathcal{V}$ -index computation.

## 2. Materials and Methods

### 2.1. Simulated data

Simulated 12-lead ECGs were generated by combining synthetic T-waves with QRS complexes and f-waves extracted from real data. The ECGs were  $5.57 \pm 0.41$  hours long and had a mean heart rate of  $54.1 \pm 4.0$  bpm.

The T-waves were simulated using a re-implementation of the forward ECG model on which ECGSIM is based and

provided the repolarization times across the ventricular surface [21]. The model was composed by two 3D geometries (meshes) for heart (its surface was discretized into 257 nodes) and torso, plus the bio-electrical model. The myocytes associated with a given node were lumped together and shared the same transmembrane potential (TMP). Virtual electrodes were placed on the torso mesh to resemble the standard 12-lead ECG configuration. Seven different values of  $s_\theta$  were used, from 13.3 to 73.3 ms with step of 10 ms and for each one, 300 T-waves were simulated (see Figure 1).

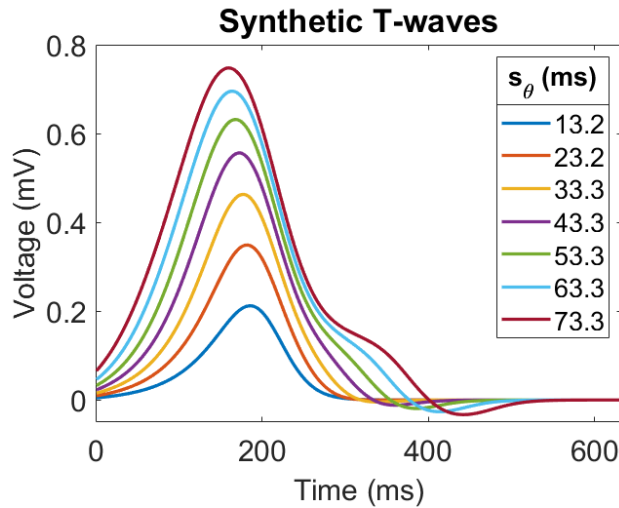


Figure 1. Median of 300 synthetic T-waves in Lead I with different values of  $s_\theta$  (ms).

The QRS complexes from the 12 leads were extracted by locating the R peak and selecting a window (-60, +100 ms) centred around it. Finally, the synthetic T-waves, the QRS complex and a 0V baseline were combined with 50 ms crossfade overlap to create the resulting ECG signals.

The f-waves were then randomly extracted from 50 real AF signals using a spatiotemporal QRST cancellation technique introduced by Stridh and Sörnmo (see [22] for more details). The real f-wave were  $4.74 \pm 0.76$  hours long with mean amplitude equal to  $0.10 \pm 0.05$  mV in Lead I.

## 2.2. $\mathcal{V}$ -index computation

In order to calculate the  $\mathcal{V}$ -index, the lead factors  $\omega_1$  and  $\omega_2$  have to be calculated. The method used consisted in estimating the dominant T-wave (DTW), which can be modelled by a linear equation that links the TMP to the surface potentials:

$$\Psi = \mathbf{AD} = \mathbf{A} \begin{bmatrix} D(t - \rho_1) \\ \vdots \\ D(t - \rho_M) \end{bmatrix} \quad (1)$$

where  $\Psi$  is the vector of surface potentials and  $\mathbf{A}$  [ $L \times M$ ] is a transfer matrix which is fixed for a given subject, where  $L$  is the number of leads and  $M$  the number of nodes in which the heart surface is divided.  $D(t)$  represents the average shape of the repolarization phase of the TMP while  $\rho_m$  is the repolarization time. (See [14] for more details).

Eq. 1 can also be expressed as:

$$\Psi(t) \approx \sum_{k=1}^N \omega_k \frac{d^{k-1}}{dt^{k-1}} T_d(t) \quad (2)$$

where  $T_d$  is the DTW (the derivative of  $D(t)$ ),  $\omega_k$  is a [ $L \times 1$ ] vector of lead factors and  $N$  is the number of Taylor terms included. For computational simplicity we took  $N = 2$  and so, Eq. 2 can be written as:

$$\Psi(t) \approx \omega_1 T_d(t) + \omega_2 \dot{T}_d(t) \quad (3)$$

where  $\omega_1$  and  $\omega_2$  are the first two lead factors and  $\dot{T}_d$ , the DTW's derivative (see [15] for more details on the computation of  $\omega_1$  and  $\omega_2$ ). Finally, the approximate measure of the dispersion of the ventricular myocytes' repolarization times  $s_\theta$  is described by the following equation:

$$\mathcal{V}\text{-index} = \frac{\text{std}[\omega_2]}{\text{std}[\omega_1]} \approx s_\theta \quad (4)$$

To assess the influence of f-waves on the computation of the  $\mathcal{V}$ -index, the index was computed on the simulated ECG with f-waves (fECG) as well as on the ECG where f-waves were removed (cECG). For the removal of the f-waves, a variation of the QRST cancellation algorithm was used. In this variation, once the QRST waves are cancelled in the ECG, the result which would contain the f-waves is subtracted from the original ECG, obtaining the ECG without f-waves (cECG).

## 3. Results

First, the values of the  $\mathcal{V}$ -index calculated before the f-waves were added (t $\mathcal{V}$ -index) were compared to the standard deviation of ventricular myocytes' repolarization times ( $s_\theta$ ) which the synthetic T-waves were based on. In Figure 2a, it can be appreciated that the computed  $\mathcal{V}$ -index is very close to the real  $s_\theta$ . The figure shows that the  $\mathcal{V}$ -index has a strong correlation with  $s_\theta$  (Pearson correlation = 0.99, p-value < 0.001) proving the validity of the method used to calculate the  $\mathcal{V}$ -index.

The  $\mathcal{V}$ -index was computed on the simulated ECG with added f-waves (f $\mathcal{V}$ -index), and after the f-waves were cleaned (c $\mathcal{V}$ -index). A comparison of their values for the different T waves is shown in Figure 2b, with

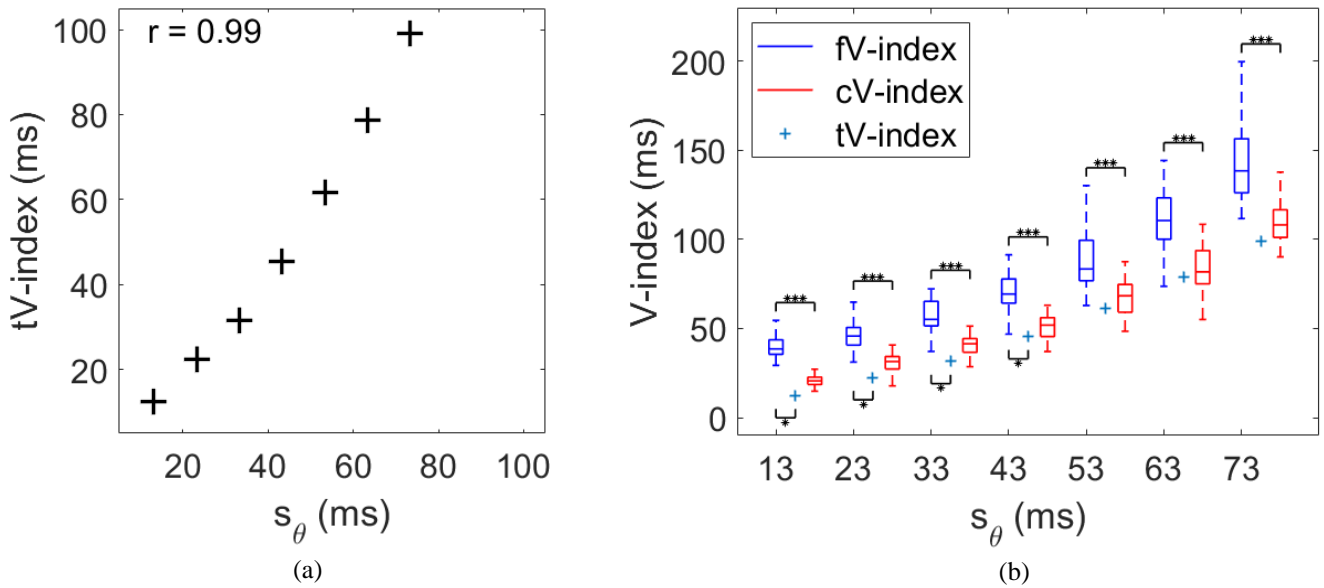


Figure 2. (a) Correlation between  $tV$ -index (ms) and  $s_\theta$ , (b) Comparison between  $V$ -index with f-waves ( $fV$ -index),  $V$ -index after f-waves removal ( $cV$ -index),  $tV$ -index calculated.

superimposed the  $tV$ -index.

The figure shows the boxplots of the calculated  $V$ -index when the f-waves were added ( $fV$ -index), when the f-waves were removed ( $cV$ -index) and the target  $tV$ -index for each of the different T-waves synthesized. It can be observed that the presence of f-waves corrupts the  $V$ -index overestimating its value, having a highly significant difference (p-value < 0.001) between the  $fV$ -index and  $cV$ -index. There is also a significant difference (p-value < 0.05) between the  $fV$ -index and the  $tV$ -index for values below 53.3ms. On the other hand, there is a non-significant difference between  $cV$ -index and  $tV$ -index for the whole range of  $V$ -index values studied.

#### 4. Discussion

Non-invasive assessment of ventricular repolarization heterogeneities during AF is not a straightforward task, consequence of the irregular ventricular activity present under this condition. There have been many ECG-derived markers proposed for the assessment of the heterogeneities of ventricular repolarization such as the QT interval, QT dispersion or T-wave alternans to mention a few. However, these markers require the patient to be in sinus rhythm to be properly assessed [23] which makes them less appropriate for studying AF as the properties of the AV node and atrial electrophysiology influence the highly irregular ventricular response.

In respect to QT measurements,  $V$ -index has the advantages of being a direct estimator of the spatial heterogeneity of ventricular repolarization and of being only marginally affected by misdetection of T-waves

fiduciary points (as for instance the T-peak or T-end). However, the  $V$ -index has previously been assessed only during SR, thus we aimed at assessing whether it is possible to quantify it during AF. As a preliminary study, we analyzed simulated data only and the results show the importance of removing the f-waves before computing the  $V$ -index. The  $V$ -index estimates the spatial heterogeneity of ventricular myocytes' repolarization times  $s_\theta$ , yielding higher values as the heterogeneity increases. The presence of f-waves introduces a bias and the  $V$ -index is overestimated. The findings show that the  $V$ -index values calculated after the f-waves were removed ( $cV$ -index) are very close to the target  $tV$ -index (non-significant difference) for the range of values studied.

#### 5. Conclusion

In this paper, a new methodological approach of pre-processing the ECG signal before the computation of the  $V$ -index has been introduced. The proposed method is based on an f-wave cancellation algorithm that eliminates f-waves before the T-waves are used to compute the  $V$ -index. The process was tested using simulated ECG signals that were generated using synthetic T-waves with increasing values of heterogeneity of ventricular repolarization  $s_\theta$ , real QRS complexes and real f-waves extracted from ECG obtained from patients with AF. It has been shown that after the f-waves were removed, the  $V$ -index values were similar to the target  $tV$ -index values, presenting non-significant differences. In future works, the validity of the method will be tested with the computation of the  $V$ -index during AF in clinical ECG data.

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