

# Changes in T-peak-to-T-end Morphology Measured by Time-Warping Are Associated with Ischemia-Induced Ventricular Fibrillation in a Porcine Model

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## Abstract

In this work we assess, the association of a time-warping-based morphology variation index computed between the peak and the end of the T wave,  $d_w$ , with the occurrence of ventricular fibrillation (VF) episodes in ischemic conditions. Dynamic increases of the  $d_w$  index during ischaemia progression in pigs are associated with VF occurrence.

## Introduction

The dispersion of ventricular repolarization reflected on the  $T_{pe}$  interval has shown potential in predicting arrhythmic risk [1], avoiding annotation errors on T wave onset determination as consequence of the ST elevation. The ability of the time-warping based index proposed by Ramírez et al. [2], restricted from the T-peak to T-end part of T wave, was evaluated during a human model of short time induced ischemia by percutaneous coronary intervention (PCI). In that study, the index capability in capturing ischemia induced T-peak to T-end waveform modification is reported. The present study aims to evaluate if this  $d_w$  index, restricted to T-peak to T-end, is associated with ventricular fibrillation risk in a porcine model of prolonged ischemia.

## Materials and Methods

The study population included 26 pigs undergoing a closed-chest myocardial infarction model by PCI intervention [3]. Balloon inflation in the left descending artery (LAD) was performed in each pig to induce ischemia. 12-lead ECG recordings, digitized at a sampling rate of 1024 Hz and an amplitude resolution of 1.18  $\mu$ V per bit, were used to monitor the pigs before the balloon inflation (Control stage) and throughout the 40-minute occlusion period

(Occlusion stage). From the total study population, 16 pigs did not suffer from VF (non-VF group) and 10 pigs suffered from VF (VF group).

## Quantification of T-peak to T-end wave morphology changes

Linear filtering, first with a low-pass 40-Hz cut-off frequency for electric and muscle noise removal, then with a high-pass 0.5-Hz cut-off frequency, for baseline wander attenuation, both bidirectional Butterworth of sixth-order was applied. ECG delineation was performed using a wavelet-transform-based single-lead method [4] to obtain the QRS fiducial points. Subsequently, a multi-lead selection rule strategy [5] was applied over the 8 single-lead sets of marks to obtain the multilead QRS fiducial points. Then, spatial Principal Component Analysis (PCA) transformation was performed over the 8 standard leads, and learned over the T wave, in order to emphasize T-wave content. Finally, the first principal component lead was again delineated, and each segmented T-wave further low-pass filtered at 20 Hz cut-off frequency, with a sixth order Butterworth filter, for subsequent analysis.

The T-peak to T-end wave morphology changes along time were quantified by the  $d_w$  index proposed by Ramírez in [2], and adapted in [6] to restrict it to the last part of the T wave. For each s-th 15 second moving signal window along the recording (with 10-s overlap between windows), T waves were extracted and a mean warped T-peak to T-end wave (MWTPE) was computed. The reference MWTPE was computed from the first 60 seconds at the beginning of the control stage so that  $d_w$  represents the T-peak to T-end wave morphological changes relative to the initial state. For each window, the marker  $d_w(s)$  is estimated as the temporal reparametrization between

two waves, a MWTPE,  $f^s = [f^s(t^s(1)), \dots, f^s(t^s(N_s))]^T$ , where  $t^s = [t^s(1), \dots, t^s(N_s)]^T$ , together with a selected reference MWTPE,  $f^r(t^r)$ .  $d_w$  index is the mean amount of warping needed to minimise the time domain differences among these different MWTPE, the one under study  $f^s(t^s)$ , and the reference  $f^r(t^r)$ , resulting in a series  $d_w^{PCA}(s) (s \in \{1, \dots, S\})$  sampled at each 5 seconds relative to the initial reference.

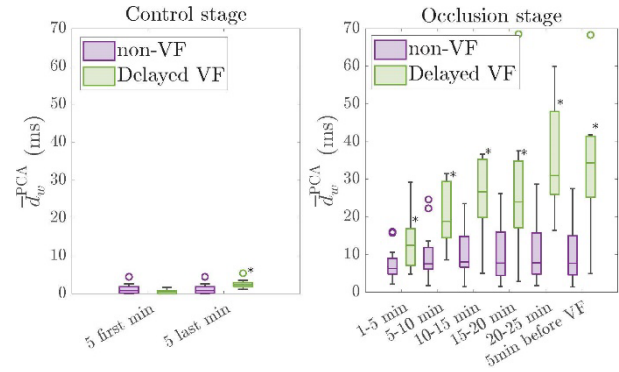
**$d_w$  series estimation through warping functions.** Let  $\gamma(t^r)$  be the warping function that relates  $t^r$  and  $t^s$  such that the composition  $[f^s \circ \gamma](t^r) = f^s(\gamma(t^r))$  denotes the re-parameterization, or time-warping, of the  $f^s(t^s)$  using  $\gamma(t^r)$ . As in [2] the square-root slope function (SRSF) was used instead of the original signals, to find the optimal warping function so avoiding the so called “pinching effect”. The optimal warping function,  $\gamma^*(t^r)$ , is the one that minimizes the amplitude difference between the SRSF of  $f^r(t^r)$  and  $f^s(\gamma(t^r))$ . The level of warping represents the amount of time stretching needed to optimally fit the wave under study relative to the reference one. The  $d_w$  biomarker quantifies this level of warping required as the average of the absolute difference value between  $\gamma(t^r)$  and  $t^r$ .

## Results and discussion

During control recordings,  $d_w^{PCA}$  remained stationary with a median value [IQR] of 1.76 [1.80] ms. During artery occlusion,  $d_w^{PCA}$  followed a well-marked gradual increasing trend as ischemia progressed, with median of 15.47 [18.53] ms.

The average of  $d_w^{PCA}$  index measured in different 5 minutes intervals (last 5 minutes before the occlusion onset, at 1-5, 5-10, 10-15, 15-20, 20-25-minute intervals after occlusion onset and during 5 minutes prior to a VF episode), clustered for the two-pig group are presented in Fig. 1. These  $d_w^{PCA}$  averages were significantly higher for VF group than in the non-VF group with a median value of 0.82, 0.83, 6.25, 7.56, 8.02, 7.76, 7.81 and 7.65 vs 0.44, 2.35, 12.45, 18.78, 26.71, 23.96, 30.95 and 34.37, and  $p$ -value of 0.223, 0.011, 0.035, 0.001, 0.001, 0.007, 0.002 and 0.001, for each interval, respectively. As occlusion time progresses, significant inter-individual differences were found in the magnitude of  $d_w^{PCA}$  changes for VF group already from the first 5 minutes of occlusion, ranged from a negligible variation at the beginning of the occlusion to a pronounced magnitude as time elapses. The very significant increase in  $d_w^{PCA}$  for the VF group relative

to the non-VF group as ischemia progress indicate that increases in  $d_w^{PCA}$  magnitude beyond some threshold are associated with the occurrence of VF episodes.



**Figure 1. Comparison of  $d_w$  averages, for the VF subgroup and non-VF subgroup, measured in different 5 minutes segments. \* indicates statistical significance between groups.**

## Conclusions

In a porcine myocardial infarction model, the time-warping-based marker,  $d_w$ , restricted to T-peak to T-end interval, allows to monitor ischemia-induced repolarization changes. Larger increase of  $d_w$  during ischaemia progression is associated with VF occurrence and suggest further evaluation in humans.

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