Simultaneous Comparison of Electrocardiographic Imaging and Epicardial Contact Mapping in Structural Heart Disease

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Abstract

Background: The accuracy of ECG Imaging (ECGI) in structural heart disease remains uncertain. This study aimed to provide a detailed comparison of ECGI and contact-mapping system (CARTO) electrograms.

Methods: Simultaneous epicardial mapping using CARTO (Biosense-Webster, CA, USA) and ECGI (CardioInsightTM) in 8 patients was performed to compare electrogram morphology, activation (AT) and repolarization (RT) times. Agreement between AT and RT from CARTO and ECGI was assessed using Pearson's correlation coefficient, ρ_{AT} and ρ_{RT} , root mean square error, E_{AT} and E_{RT} , and Bland-Altman plots.

Results: After geometrical co-registration, 711 (439-905) (median, first-third quartiles) ECGI and CARTO points were paired per patient. Activation time maps showed ρ_{AT} =0.66 (0.53-0.73) and E_{AT} =24 (21-32) ms, RT maps showed ρ_{RT} =0.55 (0.41-0.71) and E_{RT} =51 (38-70) ms. The median correlation coefficient measuring the morphological similarity between the unipolar electrograms was equal to 0.71 (0.65-0.74) for the entire signal, 0.67 (0.59-0.76) for QRS complexes and 0.57 (0.35-0.76) for T-waves. Local activation map correlation, ρ_{AT} , was lower when default filters were used (0.60 (0.30-0.71), P=0.053). Small misalignment of the ECGI and CARTO geometries (below ±4 mm and ±4 deg) could introduce variations in the median ρ_{AT} up to ±25%. Minimum distance between epicardial pacing sites and the region of earliest activation in ECGI was 13.2 (0.0-28.3) mm from 25 pacing sites with stimulation to QRS interval <40 ms.

Conclusions: This simultaneous assessment demonstrates that ECGI maps activation and repolarization parameters with moderate accuracy. ECGI and contact electrogram correlation is sensitive to electrode apposition and geometric alignment. Further technological developments may improve spatial resolution.

Keywords: Contact mapping, ECG-Imaging, CardioInsight, Activation and Repolarization Maps, Unipolar Electrograms, Ventricular Tachycardia

Introduction

Electrocardiographic imaging (ECGI) utilizes body surface potentials and heart-torso geometries to reconstruct epicardial unipolar electrograms. This is achieved applying an "inverse solution" and provides insight into the electrophysiological substrate customarily only delineated with invasive contact electro-anatomical mapping (EAM) ^{1,2}.

The ability to delineate whole tachycardia circuits using a single beat has important implications for haemodynamically-unstable ventricular tachycardias (VTs), which cannot be easily mapped using EAM ³. Furthermore, this technology could facilitate risk stratification in primary prevention ICD candidates ^{4,5}.

Initial experimental validation of the methodology utilizing a tank-torso model showed its ability to image cardiac activation and repolarization ^{2,6,7}, which was confirmed in open chest canines versus contact electrogram data ⁸. Human work during cardiac surgery showed promising results although the contact and ECGI maps were not acquired simultaneously ⁹. This has culminated in the use of the system for ablation of focal ectopy, VT, atrial fibrillation^{10,11} and non-invasive ablation of ventricular arrhythmias with radiotherapy ^{12,13}.

However, despite the range of clinical applications there has been no direct quantitative simultaneous comparison to contact electrogram data in the intact human heart. Simultaneous collection of epicardial contact and body surface ECGI data in canine and porcine models showed moderate correlation for activation time (AT) and repolarization time (RT) ^{14,15}. In humans, a using a 120 lead system, simultaneous contact electrical data demonstrated variable accuracy for locating epicardial pacing sites and qualitatively assessed ventricular activation sequences ¹⁶. Non-

simultaneous mapping recently showed ECGI reconstruction of activation sequences was poor during sinus rhythm with a narrow QRS complex ¹⁷.

This study set out to prospectively compare *simultaneously*-recorded epicardial contact electrograms with reconstructed epicardial electrograms from a 252 electrode ECGI system (CardioInsight[™], Medtronic, MN, USA) in the intact human heart.

Methods

The authors declare that all supporting data are available within the article and its online supplementary files. The row data that support the findings of this study are available from the corresponding author upon reasonable request. Eight patients (5 male, 3 female), aged 45.9±15.5 years undergoing epicardial catheter ablation of structurally abnormal heart VT were studied with ECGI mapping during ablation. All patients were scheduled for a catheter ablation procedure on clinical grounds and gave their informed consent to participate in the research study. The study was approved by the National Research Service Committee, London (14/LO/0360).

Clinical Procedure

Procedures were performed with the patient under general anaesthetic (GA). Endocardial access was obtained under ultrasound guidance using Seldinger technique via the right femoral vein +/- right femoral artery. A sub-xiphisternal puncture using a Tuohy needle, with fluoroscopic guidance, was used to access the epicardial space ¹⁸. An Electro-anatomical map (EAM) (CARTO, Biosense-Webster, CA, USA) of the epicardial surface was created during right ventricular pacing in six patients, biventricular pacing in one patient and atrial pacing in another. This was to ensure stable rhythms for electrogram data collection. For the latter two patients pacing modalities were chosen to improve haemodynamic status during mapping. A multipolar catheter (Pentarray or Decapolar, Biosense-Webster, CA, USA) was used for all cases. Unipolar electrograms were collected from all points during EAM creation with bandpass filters set at 0.5Hz to 500Hz and a sampling frequency of 1000 Hz. Pacing was performed from multiple locations on the epicardium at <10 mA.

ECGI recordings

Prior to catheter ablation, a 252 electrode vest (CardioInsight[™], Medtronic, MN, USA) was fitted for recording of body surface potentials (sampling rate 1000 Hz) and remained in situ until conclusion of the procedure. A non-contrast axial CT scan with 3 mm slice thickness was performed up to four hours before the procedure. Patient-specific epicardial geometry was created using the EcVue system (Medtronic, MN, USA) with data from the CT and body surface potentials. Epicardial unipolar electrograms were computed over approximately 1400 epicardial points covering both ventricles using both unfiltered and filtered (low pass 50 Hz) data, with those over the atrioventricular valves manually excluded. A full aortic mesh, comprising the ascending, arch and descending portions, was created in patients with arterial access. If arterial access was not obtained a detailed geometry of the right ventricular outflow tract (RVOT), inferior vena cava (IVC) and superior vena cava (SVC) was generated.

Data Analysis

Unipolar electrograms from CARTO and ECGI were *independently analysed* with bespoke software (Matlab, The Mathworks Inc., MA, USA). After pacing artefact removal, signals were band-pass filtered between 0.5 and 80 Hz for AT measurement and between 0.5 and 20 Hz for RT measurement. Activation time was measured as

the time of the steepest signal downslope (dV/dt_{min}) during the QRS complex and RT the time of steepest upslope (dV/dt_{max}) during the T-wave ^{19,20}. All signals were carefully reviewed and semi-automatically corrected if needed as in previous studies ^{21,22}.

Co-registration of EAM and ECGI geometries was performed semi-automatically with bespoke software (Matlab, The Mathworks Inc., MA, USA). As Figure 1 shows, accuracy was achieved by simultaneous alignment of all prominent anatomical geometries including the Aorta (4 patients) and IVC and RVOT (in 4 patients). The optimal co-registration was visually determined by two experts independent of subsequent analysis. After co-registration, for each point belonging to the ECGI geometry, the closest point belonging to the CARTO geometry was found and the two points were paired for comparison. ECGI and CARTO points were paired only if their Euclidean distance was lower than D=8 mm. To reduce the effect of outliers, spatial smoothing was performed by averaging AT and RT of points contained within a D=8 mm radius. The analysis was repeated for D ranging from 5 to 14 mm to assess the impact of spatial smoothing on the results. To assess the sensitivity of our results to co-registration between ECGI and CARTO geometries, the analysis was repeated after applying small changes to the optimal co-registration. In total, the analysis was repeated 4096 times per patient consistent with all possible configurations obtained by applying a shift of -4, -2, +2 and +4 mm and a rotation of -4, -2, +2 and +4 degrees along and around the three major axes.

To assess spatial resolution of the localization of earliest sites of epicardial activation, the minimum Euclidean distance between the pacing pole (projected onto the ECGI ventricular geometry) and the region of earliest activation (within the first 5th percentile)

in the ECGI map was measured. The time from stimulus to QRS (S-QRS) was calculated for each pacing beat. Beats were then separated into those with a S-QRS of <40msec and >40msec.

Statistical analysis

Data distribution is described by median (first-third quartiles). Statistical differences were assessed using the Wilcoxon rank sum test for unpaired comparisons and the Wilcoxon signed rank test for paired comparisons. Threshold for statistical significance was 0.05. The morphological similarity between each pair of signals was assessed using Pearson's correlation coefficient. The agreement between activation and repolarization sequences between the two modalities was quantified with the root mean square error, Pearson's correlation coefficient and Bland-Altman plots. Interpatient correlations between e.g. the correlation coefficient for AT or RT maps and QRS duration, QRS amplitude or number of electrodes in contact with the body surface were assessed using Spearman's correlation coefficient. Data and statistical analyses were conducted in MATLAB, MathWorks.

Results

Eight patients were studied. Five were elective procedures with the remaining three in-patient emergency procedures. Baseline characteristics can be seen in Table 1. The prevalence of ARVC cases accounted for by the epicardial nature of this condition.

Activation and repolarization maps

3790 (1845-6022) (median, Q1-Q3) and 1385 (1362-1395) unipolar signals per patient from CARTO and ECGI, respectively, were used for the analysis. Of these, 711 (439-

905) per patient were paired and used for comparison. Figures 2 and 3 show examples of AT and RT maps produced by the two systems for comparison, while numerical results are shown in Table 2. Visually, there was consistency between ECGI and EAM maps. Correlation coefficient measuring the similarity of AT and RT sequences was equal to 0.66 (0.53-0.73) for AT and 0.55 (0.41-0.72) for RT, while root mean square error was equal to 24 (21-35) ms for AT and 51 (38-70) ms for RT. Seven of eight patients had a correlation coefficient for AT sequence higher than 0.5. Scatter-plots and Bland-Altman plots showing inter-modality agreement for AT and RT per each patient are shown in Supplementary Figures 1-8. The correlation coefficient for AT maps showed moderate correlation with QRS duration (ρ =0.52), suggesting that slower AT sequences can be non-invasively mapped more reliably, and with mean QRS amplitude of the 12 leads ECG (ρ =0.65, excluding the one patient with atrial pacing) suggesting that structural heart disease and low signal amplitude may reduce mapping accuracy. The number of body surface potentials included in the computation of the inverse problem also showed moderate correlation with correlation coefficient for AT maps (ρ =0.40), indicating that care should be taken in maintaining good contact between the ECGI vest and patient's torso. The correlation coefficient for AT maps decreased from 0.66 (0.53-0.73) to 0.60 (0.30-0.7), P=0.053, if the body surface potentials were low-pass filtered using the by default filter setting of the CardioInsight[™] system prior to reconstructing the epicardial potentials.

Signal morphology

The correlation coefficient measuring the morphological similarity between unipolar electrograms recorded with contact mapping and computed with ECGI was equal to 0.71 (0.65-0.74) when considering the entire duration of the signal, and equal to 0.67

(0.59-0.76) within the QRS complex and 0.57 (0.35-0.76) for the T-wave (see Table 2). Seven of eight patients had a morphological correlation coefficient for the QRS complex higher than 0.5. These results were not significantly different when computed using pre-filtered data. Supplementary Figures 9-16 show the distribution of the correlation coefficient and representative electrogram examples going from best to worst correlation. There was a marked intra-patient variability in the correlation coefficients measuring morphological similarity between recorded and computed electrograms, with median interquartile range equal to 0.67.

Localization of earliest sites of activation

In figure 4 examples of localisation of pacing sites on the EAM to the area of earliest activation on ECGI map are shown for three representative patients. The white circle represents the pacing site projected onto the ECGI geometry. Table 3 shows distance for pacing site accuracy in all patients.

Overall, the distance from n=46 epicardial pacing sites to the corresponding areas of earliest activation was 20.7 (9.6-33.2) mm. This was significantly lower for the n=25 pacing sites for which local capture was confirmed by a short stim-to-QRS interval, with distance equal to 13.2 (0.0-28.3) mm for stim-to-QRS interval \leq 40 ms versus 32.6 (21.5-45.8) mm (P<0.001) for stim-to-QRS interval >40 ms.

Agreement between EAM and ECGI in low-voltage regions

Low-voltage regions were defined as cardiac sites for which EAM registered a bipolar signal amplitude <0.5 mV. Indices of agreement between EAM and ECGI calculated in low voltage regions were not different to those calculated in normal voltage regions (Supplementary Table 1). Pacing sites were considered as belonging to a low-voltage

region if the median bipolar amplitude recorded with EAM within a search radius equal to 4 mm was <0.5 mV. The distance between pacing sites and the regions of earliest activation in ECGI was not different when comparing pacing sites in low versus normal voltage regions (Supplementary Table 1).

Effects of anatomical co-registration

Parameter *D*, which corresponds to the minimum distance used for pairing cardiac sites from EAM and ECGI maps and determines the amount of spatial smoothing did not have a significant impact on the results (Supplementary Fig. 17). On the other hand, small variations in the anatomical co-registration may have an impact on the results. Although on average the agreement between ECGI and CARTO AT maps (ρ_{AT}) did not change after applying small changes to the optimal anatomical co-registration (Supplementary Table 2), the selection of the configuration that for each patient maximises or minimises ρ_{AT} (see Supplementary Figure 18-25 for comparison) would have resulted in a ±25% variation of the median ρ_{AT} (Supplementary Table 1).

Discussion

This is the first quantitative comparison of reconstructed electrograms using ECGI versus *simultaneously recorded* contact epicardial data, in the intact human heart. The main findings are: Morphological correlation between recorded and computed unipolar electrograms show median correlation coefficient per patient was equal to 0.71 (0.65-0.74); AT maps showed a correlation of ρ_{AT} =0.66 (0.53-0.73) and error of E_{AT} =24 (21-32) ms; RT maps showed ρ_{RT} =0.55 (0.41-0.71) and E_{RT} =51 (38-70) ms. Minimum distance between epicardial pacing sites and the region of earliest activation in ECGI was 13.2 (0.0-28.3) mm for pacing sites where a short stim-to-QRS interval confirmed local capture. This quantitative assessment is sensitive to anatomical co-registration.

Overall these data suggest that the accuracy of the non-invasive mapping system may not provide sufficient resolution to guide radio frequency ablation of ventricular arrhythmias but could shorten, and potentially improve the efficiency of ablation procedures by allowing rapid targeting for contact mapping focal ectopics or in situations of haemodynamic instability.

The correlations reported in this study are similar to those demonstrated in proof-ofprinciple studies. Initial experiments using the tank-torso model found a correlation coefficient (CC) of 0.81 for AT ⁶ but the tank-torso model does not take into account motion artefact during respiration or the effect of lung tissue between the epicardium and body surface electrodes ²³.

A CC of 0.72 for AT was found in cardiac surgery patients using consecutive and not simultaneously recorded data ⁹. More recently, a canine model, under closed-chest conditions, found a median CC of 0.73 for AT ¹⁴. While these data show higher correlation than 0.66 we observed, our data are the first simultaneously-recorded quantitative clinical data taken during an ablation procedure. Our results are comparable to a simultaneous ECGI epicardial sock closed chest porcine study showing mean CCs for reconstructed epicardial potential distributions ranged from 0.60±0.08 to 0.64±0.07 and general activation spread median CC 0.72-0.78 for activation time maps after spatio-temporal smoothing ¹⁵.

Our results contrast with recently published data comparing ECGI and EAM in 55 patients, where AT was found to be largely inaccurate (CC 0.03 ± 0.43)¹⁷. Mapping

was performed mainly during sinus rhythm, with better correlation seen during paced rhythms. The study used the commercially available system for production of AT maps without curation of individual electrogram timing measurements. The lower values could reflect the methods used to create ECGI maps and the fact that bipolar electrograms from EAM were utilised without direct cross-correlation with the corresponding unipolar contact signals which could be a further source of erroneous measurement. We used bespoke software to analyse the electrograms along with manual editing. In our experience significant editing of the electrograms is required to ensure accurate annotation of AT in both contact and non-contact mapping data. We also found moderate association between AT maps correlation and body surface QRS duration (ρ =0.52). This suggests that ECGI maps slower myocardial activation wavefront progression more accurately and has important implications for mapping during narrow QRS rhythms where recent data indicated reduced accuracy of identifying epicardial breakthroughs and location of lines of block by comparison with high density epicardial mapping¹⁷. Narrower QRS complexes reflect more rapid myocardial activation utilizing the Purkinje network and are not representative of the slower activation of ventricular arrhythmias and epicardial pacing. Epicardial recruitment would be expected to be slower to enable more accurate mapping by ECGI since larger myocardial segments will be activated simultaneously within the temporal-spatial resolution of the system. Indeed, recent success in targeting of ablation resistant VT circuits using ECGI mapping indicates that resolution may be sufficient for delivering stereotactic radiation for non-invasive VT ablation. VT episodes decreased from 119 (4-292) to 3 (0-31) in 19 patients at 6 months post treatment ^{12,13}. This novel methodology has thus far been performed in a single centre and further

research will be needed into both its long-term efficacy and the role played by ECGI to guide this ablation modality.

Filter settings on the ECGI system exert significant effects, as local activation map correlation, ρ_{AT} , was significantly lower when default filters were used. This is important as commercially-available systems currently automatically apply a low pass filter of 50 Hz. Optimization of the number of electrodes in good contact with the body surface is also needed as utilizing fewer electrodes may confound results.

To the best of our knowledge, this is the first attempt in humans to quantify the relationship of RT between recorded and reconstructed electrograms. Reconstruction of spatial variation of RT is an important feature of ECGI in the potential risk stratification of arrhythmic risk ²⁴. Human torso models have shown that myocardial repolarization was accurately reflected by ECGI ^{8,25}. Our results can be compared to the afore-mentioned canine model which showed CC of 0.6 ¹⁴. Correlations are lower than those for AT. This is expected given the smaller amplitude of the T wave, increasing susceptibility to noise and electrogram smoothing introduced by the inverse solution algorithm. Furthermore, as reported in direct porcine study, although the overall electrogram CC between measured and reconstructed epicardial electrograms was ≈0.7, the interquartile ranges were wide. That is, while agreement was reasonable in ≈50% of cases, it was much less in the remainder¹⁵.

Indices of agreement between ECGI and EAM were not different in low voltage as compared to normal voltage regions. This may be explained by the fact that in fibrotic tissue the local component of the unipolar electrogram is small or non-existent and the signal is essentially composed of far-field potential ²⁰, which may be measured by both contact and non-contact systems with moderate correlation.

Localisation of pacing sites

The minimum distance between epicardial pacing sites and the region of earliest AT in ECGI was 13.2 mm (0.0-28.3) from 25 pacing sites with stim-to-QRS<40 ms. The distances were significantly greater with stim-to-QRS >40msec. Other research has shown resolution for locating pacing of around 10mm ^{9,26} ²⁷ with a more contemporary study in humans of <10mm for both RV and LV endocardial pacing ²⁸. The only other study to perform a simultaneous epicardial pacing in humans found results in keeping with ours¹⁶ with a decreased distance from pacing site to area of earliest activation when the stim-to-QRS was <40msec. The distance between pacing sites and the regions of earliest activation in ECGI was not greater in regions were EAM registered low bipolar voltage. As pacing from a low voltage region was not clearly associated with a long stimulus-to-QRS interval, this may be due to inaccuracies of bipolar amplitude to delineate scar^{29,30}.

Geometric Alignment

Small movements in the co-registered geometries can have large effects on correlation. Considering the most extreme cases, shifts of only ± 4 mm and rotations within ± 4 degrees can results in a variation of the ECGI-EAM AT correlation up to $\pm 25\%$. This may confound studies examining the accuracy of ECGI and should be considered in future research protocols to ensure optimal co-registration of geometries.

Limitations

This study compared contact EAM to ECGI provided by the CardioInsight[™] system as used in the cathlab during VT catheter ablation and results may not be easily extended to other ECGI methods³¹. This study focused on epicardial mapping during

pacing and hence cannot be applied to sinus rhythm where activation sequences and breakthroughs from the endocardium may differ. Pacing was used to ensure stable activation during sequential mapping and every precaution was taken to collect captured beats. However, the EAM consists of many beats collected over a few minutes and ECGI uses a single beat. Although all beats were carefully aligned off-line with custom software and manually checked, variation may occur in AT and RT over the course of this period. Recent studies have demonstrated that repeated mapping with different catheters³² or even with the same catheter but different activation wavefronts²⁹ may introduce significant differences in the delineation of the arrhythmogenic substrate. In this sense, it is not surprising to register differences between EAM and ECGI and our use of mapping catheters with slightly different configuration and intra-electrode distance (Pentarray and Decapolar) may have affected the comparison between EAM and ECGI data.

Only one full EAM was produced during pacing, which was delivered from the RV apex in all except 2 patients. Further studies should assess the effect of different pacing sites and wave-front directions on the agreement between EAM and ECGI.

Geometric alignment of the EAM and CT geometries is challenging but was optimised by using fixed anatomical landmarks as well as ensuring no geometric shifts on CARTO during data collection. However, as demonstrated by our in-depth analysis, EAM-ECGI comparison is intrinsically sensitive to small variations in the anatomical co-registration. This could also have affected the distance measurements garnered from localisation of the pacing points. EAM and ECGI systems estimate the reference potential of unipolar electrogram in a slightly different way, which may have reduced the morphological correlation. This study did not focus on the accuracy of ventricular arrhythmia localisation which is the subject of ongoing work.

Conclusions

There is a moderate correlation between reconstructed electrograms recorded using ECGI and contact unipolar electrograms recorded from the epicardium during catheter ablation of ventricular tachycardia in patients with structural heart disease. ECGI and contact electrogram correlations are sensitive to electrode apposition and geometric alignment. Further technological developments may improve spatial resolution and electrogram correlations.

Disclosures

None

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References

- Oster HS, Taccardi B, Lux RL, Ershler PR, Rudy Y.
 Electrocardiographic Imaging. *Circulation* [Internet]. 1998 [cited 2018 Dec 4];97:1496–1507. Available from: https://www.ahajournals.org/doi/10.1161/01.CIR.97.15.1496
- 2. Burnes JE, Taccardi B, Rudy Y. A noninvasive imaging modality for cardiac arrhythmias. *Circulation*. 2000;102:2152–2158.
- Dubois R, Shah AJ, Hocini M, Denis A, Derval N, Cochet H, Sacher F, Bear L, Duchateau J, Jais P, Haissaguerre M. Non-invasive cardiac mapping in clinical practice: Application to the ablation of cardiac arrhythmias. *J Electrocardiol* [Internet]. 2015;48:966–974. Available from:

https://linkinghub.elsevier.com/retrieve/pii/S0022073615002770

- 4. Rudy Y. Noninvasive Electrocardiographic Imaging of Arrhythmogenic Substrates in Humans. *Circ Res* [Internet].
 2013;112:863–874. Available from: https://www.ahajournals.org/doi/10.1161/CIRCRESAHA.112.27931
- Zhang J, Cooper DH, Desouza KA, Cuculich PS, Woodard PK, Smith TW, Rudy Y. Electrophysiologic Scar Substrate in Relation to VT: Noninvasive High-Resolution Mapping and Risk Assessment with ECGI. PACE - Pacing Clin Electrophysiol [Internet]. 2016 [cited

2018 Apr 19];39:781–791. Available from: http://doi.wiley.com/10.1111/pace.12882

- Ghosh S, Rudy Y. Accuracy of Quadratic Versus Linear
 Interpolation in Noninvasive Electrocardiographic Imaging (ECGI).
 Ann Biomed Eng [Internet]. 2005;33:1187–1201. Available from: http://link.springer.com/10.1007/s10439-005-5537-x
- Ramanathan C, Jia P, Ghanem R, Ryu K, Rudy Y. Activation and repolarization of the normal human heart under complete physiological conditions. *Proc Natl Acad Sci* [Internet].
 2006;103:6309–6314. Available from: http://www.pnas.org/cgi/doi/10.1073/pnas.0601533103
- Burnes JE, Ghanem RN, Waldo AL, Rudy Y. Imaging dispersion of myocardial repolarization, I: Comparison of body-surface and epicardial measures. *Circulation* [Internet]. 2001;104:1299–1305. Available from:

https://www.ahajournals.org/doi/10.1161/hc3601.094276

 Ghanem RN, Jia P, Ramanathan C, Ryu K, Markowitz A, Rudy Y. Noninvasive electrocardiographic imaging (ECGI): Comparison to intraoperative mapping in patients. *Heart Rhythm* [Internet].
 2005;2:339–354. Available from:

http://www.scopus.com/inward/record.url?eid=2-s2.0-

15944376227&partnerID=40&md5=9208992b070cf5714680ab8aa

309ca91

- Jamil-Copley S, Bokan R, Kojodjojo P, Qureshi N, Koa-Wing M, Hayat S, Kyriacou A, Sandler B, Sohaib A, Wright I, Davies DW, Whinnett Z, Peters NS, Kanagaratnam P, Lim PB. Noninvasive electrocardiographic mapping to guide ablation of outflow tract ventricular arrhythmias. *Heart Rhythm*. 2014;11:587–594.
- Yamashita S, Shah AJ, Mahida S, Sellal J-M, Berte B, Hooks D, Frontera A, Jefairi N AI, Wielandts J-Y, Lim HS, Amraoui S, Denis A, Derval N, Sacher F, Cochet H, Hocini M, Jaïs P, Haïssaguerre M. Body Surface Mapping to Guide Atrial Fibrillation Ablation. *Arrhythmia Electrophysiol Rev.* 2015;4:172–6.
- Cuculich PS, Schill MR, Kashani R, Mutic S, Lang A, Cooper D, Faddis M, Gleva M, Noheria A, Smith TW, Hallahan D, Rudy Y, Robinson CG. Noninvasive Cardiac Radiation for Ablation of Ventricular Tachycardia. *N Engl J Med* [Internet]. 2017;377:2325– 2336. Available from:

http://www.nejm.org/doi/10.1056/NEJMoa1613773

- Robinson CG, Hugo GD, Lang A. Phase I/II Trial of Electrophysiology-Guided Noninvasive Cardiac Radioablation for Ventricular Tachycardia. *Circulation* [Internet]. 2018;1–9. Available from: https://www.clinicaltrials.gov/.
- 14. Cluitmans MJM, Bonizzi P, Karel JMH, Das M, Kietselaer BLJH, de

Jong MMJ, Prinzen FW, Peeters RLM, Westra RL, Volders PGA. In Vivo Validation of Electrocardiographic Imaging. *JACC Clin Electrophysiol* [Internet]. 2017;3:232–242. Available from: https://linkinghub.elsevier.com/retrieve/pii/S2405500X16305151

- Bear LR, LeGrice IJ, Sands GB, Lever NA, Loiselle DS, Paterson DJ, Cheng LK, Smaill BH. How Accurate Is Inverse Electrocardiographic Mapping? *Circ Arrhythmia Electrophysiol* [Internet]. 2018;11:e006108. Available from: http://circep.ahajournals.org/lookup/doi/10.1161/CIRCEP.117.0061 08
- Sapp JL, Dawoud F, Clements JC, Horáček BM. Inverse solution mapping of epicardial potentials: Quantitative comparison with epicardial contact mapping. *Circ Arrhythmia Electrophysiol* [Internet]. 2012;5:1001–1009. Available from: http://circep.ahajournals.org/content/early/2012/08/24/CIRCEP.111. 970160.abstract
- Duchateau J, Sacher F, Pambrun T, Derval N, Chamorro-Servent J, Denis A, Ploux S, Hocini M, Jaïs P, Bernus O, Haïssaguerre M, Dubois R. Performance and limitations of noninvasive cardiac activation mapping. *Heart Rhythm* [Internet]. 2018 [cited 2018 Oct 29];0. Available from:

https://linkinghub.elsevier.com/retrieve/pii/S1547527118310269

- Sosa E, Scanavacca M, D'Avila A, Pilleggi F. A New Technique to Perform Epicardial Mapping in the Electrophysiology Laboratory. J Cardiovasc Electrophysiol. 1996;7:531–536.
- Coronel R, de Bakker JMT, Wilms-Schopman FJG, Opthof T, Linnenbank AC, Belterman CN, Janse MJ. Monophasic action potentials and activation recovery intervals as measures of ventricular action potential duration: Experimental evidence to resolve some controversies. *Heart Rhythm* [Internet]. 2006;3:1043– 1050. Available from: http://dx.doi.org/10.1016/j.hrthm.2006.05.027
- Orini M, Taggart P, Lambiase PD. In vivo human sock-mapping validation of a simple model that explains unipolar electrogram morphology in relation to conduction-repolarization dynamics. *J Cardiovasc Electrophysiol* [Internet]. 2018;29:990–997. Available from: http://doi.wiley.com/10.1111/jce.13606
- Orini M, Taggart P, Srinivasan N, Hayward M, Lambiase PD. Interactions between activation and repolarization restitution properties in the intact human heart: In-vivo whole-heart data and mathematical description. *PLoS One* [Internet]. 2016;11:e0161765. Available from: http://dx.plos.org/10.1371/journal.pone.0161765
- Martin CA, Orini M, Srinivasan NT, Bhar-Amato J, Honarbakhsh S, Chow AW, Lowe MD, Ben-Simon R, Elliott PM, Taggart P, Lambiase PD. Assessment of a conduction-repolarisation metric to

predict Arrhythmogenesis in right ventricular disorders. *Int J Cardiol* [Internet]. 2018;271:75–80. Available from:

https://linkinghub.elsevier.com/retrieve/pii/S0167527318320497

- Ramanathan C, Rudy Y. Electrocardiographic imaging: II. Effect of torso inhomogeneities on noninvasive reconstruction of epicardial potentials, electrograms, and isochrones. *J Cardiovasc Electrophysiol.* 2001;12:241–252.
- 24. Rudy Y. Noninvasive ECG imaging (ECGI): Mapping the arrhythmic substrate of the human heart. *Int J Cardiol* [Internet]. 2017;237:13–
 14. Available from:

https://linkinghub.elsevier.com/retrieve/pii/S0167527317307556

- 25. Ghanem RN, Burnes JE, Waldo AL, Rudy Y. Imaging dispersion of myocardial repolarization, II: Noninvasive reconstruction of epicardial measures. *Circulation*. 2001;104:1306–1312.
- Oster HS, Taccardi B, Lux RL, Ershler PR, Rudy Y. Noninvasive electrocardiographic imaging: reconstruction of epicardial potentials, electrograms, and isochrones and localization of single and multiple electrocardiac events. *Circulation*. 1997;96:1012– 1024.
- 27. Ramanathan C, Jia P, Ghanem R, Calvetti D, Rudy Y. Noninvasive electrocardiographic imaging (ECGI): Application of the generalized minimal residual (GMRes) method. *Ann Biomed Eng.* 2003;31:981–

994.

- Revishvili AS, Wissner E, Lebedev DS, Lemes C, Deiss S, Metzner A, Kalinin V V., Sopov O V., Labartkava EZ, Kalinin A V., Chmelevsky M, Zubarev S V., Chaykovskaya MK, Tsiklauri MG, Kuck KH. Validation of the mapping accuracy of a novel noninvasive epicardial and endocardial electrophysiology system. *Europace*. 2015;17:1282–1288.
- Tung R, Josephson ME, Bradfield JS, Shivkumar K. Directional Influences of Ventricular Activation on Myocardial Scar Characterization: Voltage Mapping with Multiple Wavefronts during Ventricular Tachycardia Ablation. *Circ Arrhythmia Electrophysiol* [Internet]. 2016;9. Available from:

http://circep.ahajournals.org/content/9/8/e004155.long

30. Glashan CA, Androulakis AFA, Tao Q, Glashan RN, Wisse LJ, Ebert M, De Ruiter MC, Van Meer BJ, Brouwer C, Dekkers OM, Pijnappels DA, De Bakker JMT, De Riva M, Piers SRD, Zeppenfeld K. Whole human heart histology to validate electroanatomical voltage mapping in patients with non-ischaemic cardiomyopathy and ventricular tachycardia. *Eur Heart J* [Internet]. 2018;39:2867– 2875. Available from:

https://academic.oup.com/eurheartj/article/39/31/2867/4956395

31. Cluitmans M, Brooks DH, MacLeod R, Dössel O, Guillem MS, Van

Dam PM, Svehlikova J, He B, Sapp J, Wang L, Bear L. Validation and opportunities of electrocardiographic imaging: From technical achievements to clinical applications. *Front Physiol* [Internet]. 2018;9:1305. Available from:

https://www.frontiersin.org/article/10.3389/fphys.2018.01305/full

32. Tschabrunn CM, Roujol S, Dorman NC, Nezafat R, Josephson ME, Anter E. High-Resolution Mapping of Ventricular Scar: Comparison between Single and Multielectrode Catheters. *Circ Arrhythmia Electrophysiol* [Internet]. 2016;9. Available from: https://www.ahajournals.org/doi/10.1161/CIRCEP.115.003841

Tables

Table 1: Baseline Characteristics. IHD – Ischaemic heart disease, DCM – Dilated Cardiomyopathy, ARVC – arrhythmogenic right ventricular cardiomyopathy, BrS – Brugada syndrome, Ao – Aorta, RV – right ventricular, RVOT – right ventricular outflow tract, A – Atria.

Patient	Age	Sex	Aetiology	Rhythm	n Anatomical UEG structure signals		Pacing maps	
1	46	F	ARVC	RV pacing	RVOT	6289	No	
2	73	М	IHD	Bi-V pacing	Aorta	3007	Yes	
3	48	М	BrS	RV pacing	Aorta	2614	Yes	
4	24	F	ARVC	RV pacing	acing RVOT 5755		No	
5	43	М	N/A	RV Pacing	Aorta	6610	No	
6	52	F	ARVC	RV pacing	RV pacing RVOT 1077		Yes	
7	58	М	ARVC	RV pacing	RVOT 4573		Yes	
8	21	М	DCM	A pacing	g Aorta 619		No	

Table 2. Agreement between ECGI and contact mapping. N-el = number of bodysurface electrodes used for ECGI calculation; Pairs: Number of epicardial points with simultaneous ECGI and CARTO data. ρ_{AT} and ρ_{RT} : Correlation coefficients for activation and repolarization times; E_{AT} and E_{RT} : Root mean square error for activation and repolarization times; , ρ_{QRS}^{med} , ρ_{TW}^{med} and ρ_{UEG}^{med} : Morphological correlation coefficient measured within the QRS, T-waves and entire signals, respectively. UEG = Unipolar electrogram. SD = Standard deviation, Q = quartile, n = number, n.u. = normalized units.

Patient	N-el <i>(n)</i>	QRS (ms)	Pairs <i>(n)</i>	ρ _{ΑΤ} (n.u.)	ρ _{RT} (n.u.)	E _{AT} (ms)	E _{RT} (ms)	ρ ^{med} (n.u.)	ρ ^{med} (n.u.)	ρ ^{med} (n.u.)
1	207	155	890	0.76	0.72	25	62	0.68	0.45	0.71
2	218	153	727	0.67	0.59	45	78	0.59	0.44	0.61
3	201	164	584	0.80	0.50	24	55	0.67	0.80	0.69
4	175	95	919	0.65	0.69	23	29	0.75	0.71	0.78
5	179	110	926	0.51	0.33	27	46	0.60	0.69	0.71
6	172	101	232	0.69	0.84	18	19	0.78	0.80	0.78
7	175	123	694	0.29	0.30	36	103	0.24	-0.11	0.23
8	181	98	285	0.54	0.51	15	48	0.78	0.26	0.71
mean	189	125	657	0.62	0.56	27	55	0.63	0.51	0.65
SD	18	28	274	0.16	0.19	10	27	0.18	0.32	0.18
First Q	175	100	435	0.53	0.41	21	38	0.59	0.35	0.65
Median	180	117	711	0.66	0.55	24	51	0.67	0.57	0.71
Third Q	204	154	905	0.73	0.71	32	70	0.76	0.76	0.74

Table 3: Distance between pacing site and earliest region of activation in ECGImaps. N = number of pacing sites; Q = quartile; Med = median; S-QRS = Intervalfrom stimulus to QRS

	Any S-QRS interval					S-QRS<40 ms				
Patient	N	Q1(mm)	Med(mm)	Q3(mm)	Ν	Q1(mm)	Med(mm)	Q3(mm)		
2	4	0.0	6.1	15.0	4	0.0	6.1	15.0		
3	17	14.8	31.3	36.3	11	7.9	30.9	32.9		
6	8	8.5	22.5	35.5	3	3.4	13.6	23.4		
7	17	8.9	19.4	31.7	7	0.0	6.8	12.3		
тот	46	9.6	20.7	33.2	25	0.0	13.2	28.3		

Figures



Figure 1: Anatomical coregistration of ECG imaging (ECGI) and CARTO geometries in 2 patients. ECGI and CARTO geometries are shown on the left and in the middle, respectively, and they are combined in a unified reference system on the right. Patient 2 is displayed in left anterior oblique and patient 4 in left lateral view.



Figure 2. Comparison of activation times during right ventricular (RV) pacing for ECG imaging (ECGI) and CARTO. Images on top are seen in right lateral view and the bottom ones in left anterior oblique. Area of earliest activation is displayed in red with purple representing areas of latest activation. Labels A, B, and C on the geometry corresponds to sites where morphological similarity of QRS complexes is high (A, correlation coefficient [cc]=0.83, 75th percentile of ccs), good (B, cc=0.66, median correlation), and low (C, cc=0.30, 25th percentile of ccs). Unipolar electrograms are shown on the **right (A–C**). LAT indicates local activation time in milliseconds.



Figure 3. Comparison of repolarization time maps from ECG imaging (ECGI) and CARTO in a representative patient. The top pictures are in left lateral view and the bottom in left anterior oblique. The left anterior descending artery is displayed for orientation and demarcation of left and right ventricles. Early repolarization is in red and late in purple. Labels A, B, and C on the geometry corresponds to sites where morphological similarity of the T-wave of the unipolar electrogram is high (A, correlation coefficient [cc]=0.91, 75th percentile of ccs), good (B, cc=0.76, median correlation), and low (C, cc=0.56, 25th percentile of ccs). Unipolar electrograms at these sites are shown on the right (A–C). LRT indicates local repolarization time in milliseconds.



Figure 4. Relation between pacing site location as defined by CARTO position at time of pacing (white circles) and ECGI maps of activation time. Three patients are included with 3 pacing sites for each. Area of early activation is in red with late activation in purple. Distance between pacing site and region of earliest activation (D) is reported next to each map. LAT indicates local activation time in milliseconds.