

# FRAMEWORK FOR SYNTHESIZING ATTACKS ON ICDs

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## INTRODUCTION

**Problem:** How can we evaluate the robustness of algorithms used in Implantable Cardioverter-Defibrillators (ICDs): medical devices that monitor heart signals (EGMs) and administer therapy?

**Previous Work:** has shown how heavy-handed electromagnetic interference [1] and slight reprogramming attacks [2] could each thwart therapy; yet, the range of possible damage from adversaries with various capabilities is not well-studied.

**Our goal:** Devise stealthy attacks against one real-time system (Rhythm ID used in Boston Scientific ICDs), as part of a broader effort to define the limits of attacks on medical cyber-physical systems.

## KEY FINDINGS

> Therapy discrimination algorithms that operate on simple, single-beat features expose potential for short-lived (single-beat) attacks.

> Deconstruction of the *Rhythm ID* algorithm into features and states assigned at each heartbeat can guide the search for malicious inputs

## ATTACK SYNTHESIS

- Interference modeled as added white gaussian noise (each of 3 heart signals)
- An adversary that has access to historical data can systematically identify features to use as a surrogate loss function (*Algm 1*)
- Stealthy attack synthesis (*Algm 2*) formulated as a **multi-objective optimization**: we aim to manipulate inputs that
  1. maximize selected feature (*from Algm 1*)
  2. minimize detectability (minimize signal-to-noise, RMSE)

Fig 1. Shows two examples, each modified using attack parameters resulting from the following procedures

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### Algorithm 1 Determine Surrogate Loss

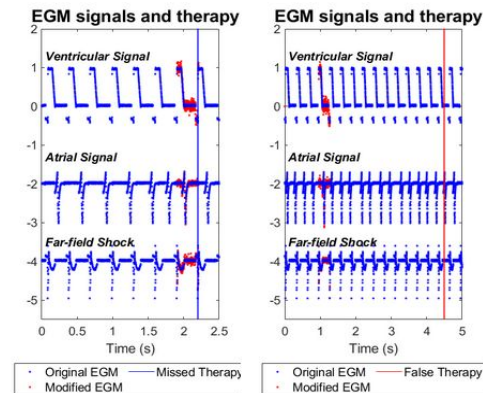
- 1: **for** each target beat, each historical trace for patient **do**
- 2:   Identify most common internal state changes required for therapy
- 3:    $L_{surrogate} \leftarrow$  first feature that causes specific state change
- 4: **end for**

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### Algorithm 2 Optimize attack parameters given target feature

- 1: **for** each historical trace **do**
- 2:    $L_{surrogate} =$  DetermineSurrogateLoss()
- 3:   attack\_parameters  $\leftarrow$  SNR, duration of attack, position of start
- 4:   Minimize (1) surrogate loss feature, (2) stealthiness wrt. attack parameters
- 5:   Evaluate success of attack with solved parameters
- 6: **end for**

FIG 1: TWO EXAMPLES OF SHORT-LIVED ATTACKS FOUND VIA MULTI-OBJECTIVE OPTIMIZATION



## NEXT STEPS

This work is a key component of a larger framework to strengthen devices; we plan to also investigate:

- Limited threat models (access to data from wearables)
- Extent of victim personalization
- More complex models (deep learning, systems of model control + machine learning)

[1] D. F. Kune, J. Backes, S. S. Clark, D. Kramer, M. Reynolds, K. Fu, Y. Kim, and W. Xu, "Ghost talk: Mitigating emi signal injection attacks against analog sensors," in *Security and Privacy (SP)*. IEEE, 2013, pp. 145–159.

[2] N. Paoletti, Z. Jiang, M. A. Islam, H. Abbas, R. Mangharam, S. Lin, Z. Gruber, and S. A. Smolka, "Synthesizing stealthy reprogramming attacks on cardiac devices," in 10th International Conference on Cyber-Physical Systems. IEEE, 2019.