

Analog Circuits and Signal Processing

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Self-powered SoC Platform for Analysis and Prediction of Cardiac Arrhythmias

 Springer

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Preface

During the last decades, medical wearable devices have gain lots of interest due to their potential influence in providing remote and ambulatory monitoring to support patients. Many devices have been developed, improved, and implemented for the long-term and continuous monitoring of the healthcare practices in general and cardiovascular diseases in particular. Due to its efficiency, simplicity, and noninvasiveness, the electrocardiogram (ECG) signal has been widely used for monitoring cardiac functions despite the development of newer techniques or technologies. The information contained in the morphological features of the ECG signal has been broadly employed to build a full classification system capable of distinguishing between normal and abnormal conditions.

This book presents the first ASIC implementation of an ECG-based signal processor (ESP) that is capable of predicting ventricular arrhythmia up to 3 h before the onset. The ESP is composed of three stages which include ECG signal processing, feature extraction, and classification, and it utilizes adaptive and novel techniques that are highly effective and suitable for real-time implementation. The extracted ECG features, individually and in combinations, showed good potential in the prediction of ventricular arrhythmia with significant statistical results, and the combination of these features has never been used in any previous detection or prediction system. Two databases of heart signal recordings from MIT PhysioNet and the American Heart Association (AHA) were used as training, test, and validation sets to evaluate the performance of the proposed system. Based on MATLAB testing results, the proposed system achieved a prediction accuracy (ACC) of 99.98% on the out-of-sample validation data by tenfold cross validation with 3-s window size.

Furthermore, the proposed ESP was developed using Verilog RTL and implemented using ASIC implementation flow based on 65-nm GlobalFoundries

low-power CMOS process. Based on the design constraints, the ESP occupied a state-of-the-art total cell area of 0.112 mm^2 and consumed a total power of $2.78 \text{ } \mu\text{W}$ at an operating frequency of 10 kHz and operating voltage of 1.2 V .

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The work in this book was part of a complete system on chip targeting a platform for wearable healthcare. We would like to thank our colleagues responsible for other parts of such a system and acknowledge their unmatched spirit of teamwork. Finally we would like to acknowledge the help and support of our families and friends and thank them for their patience and understanding.

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Abbreviations

AC	Alternating Current
ACC	Accuracy
ADC	Analog-to-Digital Converter
AFE	Analog Front End
AHA	American Heart Association
AIS	Artificial Immune System
ANN	Artificial Neural Network
AUC	Area Under ROC Curve
CaT	Calculation Time
CAN	Cardiac Autonomic Neuropathy
CI	Confidence Interval
CTS	Clock Tree Synthesis
CVD	Cardiovascular Disease
DCT	Discrete Cosine Transform
DFT	Discrete Fourier Transform
DSP	Digital Signal Processing
ECG	Electrocardiogram
ESP	ECG-Based Signal Processor
FF-NN	Feedforward Neural Network
FN	False Negative
FP	False Positive
FS	Feature Selection
HMM	Hidden Markov Model
HPF	High-Pass Filter
HPSDM-BSP	High-Pass Sigma Delta Modulator-Based Signal Processor
HT	Hilbert Transform
ICC	IC Compiler
IG	Information Gain
KUSTAR	Khalifa University of Science, Technology and Research
LDA	Linear Discriminant Analysis
LPF	Low-Pass Filter

LUT	Lookup Table
OOK	On–Off Keying
P	Precision
PAC	Premature Atrial Complexes
PAT	Pan and Tompkins
PCA	Principal Component Analysis
PE	Piezoelectric
PNN	Probabilistic Neural Network
RMS	Remote Monitoring System
RNN	Recurrent Neural Network
ROC	Receiver Operator Characteristic
RTL	Register Transfer Level
SA	Sinoatrial
SCD	Sudden Cardiac Death
SE	Recall
SRC	Semiconductor Research Corporation
STD	Standard
SVM	Support Vector Machine
TEG	Thermoelectric Generator
TN	True Negative
TP	True Positive
UWB	Ultra-Wide Band
VF	Ventricular Fibrillation
VT	Ventricular Tachycardia
WPE	Wavelet Packet Energy