# ADAPTIVE COMPRESSIVE SENSING BASED ON LEVELCROSSING SAMPLING PRINCIPLE

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#### **OUTLINE**

- Introduction
- Adaptive compressive sensing
- Level crossing sampling
- Implementation
- Simulation and results
- Conclusions

#### INTRODUCTION

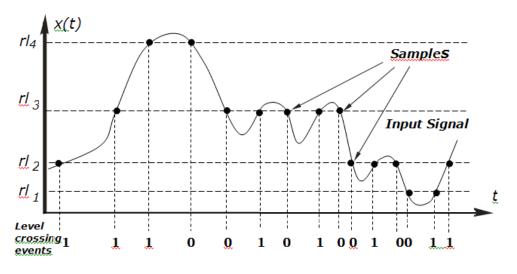
- To search for applicable ADC principles in order to essentially decrease amount of sampled data
- Proposed compressive sampling approach is based on modified level crossing sampling method. Data processing (selection) is performed during the sampling process in order to compress data
- Modified level crossing sampling as a compromise between decreased amount of data by decreasing number of reference levels and precise signal reconstruction
- To determine relationship between signal reconstruction quality and signal compression

#### **ADAPTIVE COMPRESSIVE SENSING**

- Adaptive compressive sensing is a term used to process a sparse signal – image processing
- It is using limited number of signal samples to recover the original signal
- We are proposing to implement modified level crossing sampling approach in order to decrease number of signal samples and retain expected quality of the recovered signal
- Two approaches of level crossing sampling are implemented. One is an unmodified approach, another is a modified approach

#### LEVEL CROSSING SAMPLING

- Level crossing sampling is used to adapt to the signal changes and to perform signal sampling if necessary
- Level crossing sampling is an approach for sensing signal changes. Sampling is not uniform. Signal reconstruction is more complicated.

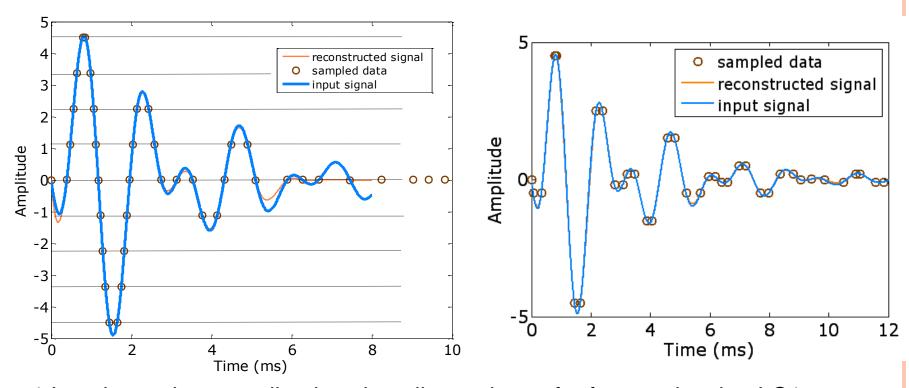




#### **TWO APPROACHES**

1. Unmodified level crossing sampling





- 1.Level crossing sampling is using all crossings of reference levels LC1
- 2. Level crossing sampling is using only extreme crossings LC2

#### **IMPLEMENTATION**

- The proposed approaches LC1, LC2 were simulated using a model - Matlab program which performed sampling with different number of reference levels
- Initially input signal was resampled using 16 x oversampling
- Level crossing sampling of input signal was performed at preset number of reference levels
- Recovery of non-uniformly sampled signal was performed using cubic spline function
- Recovered signals of both approaches were compared with original input signal

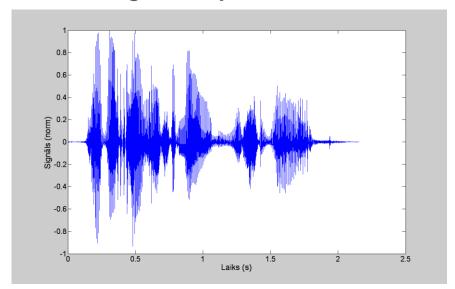
#### **USED INPUT SIGNALS**

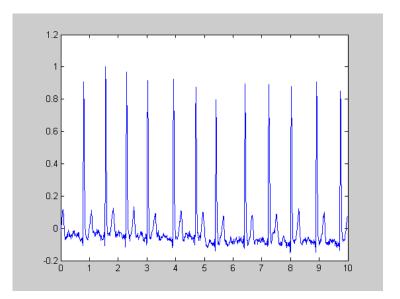
- The proposed approaches were evaluated using three different sets of signals
- TIMIT CORPUS SAMPLES speech signals from http://web.mit.edu/course/6/6.863/share/nltk\_lite/ti mit/
- Noise signals (airport, bubble, station, street etc)
   from NOIZEUS
- ECG signals from <a href="http://physionet.org/cgi-bin/ATM">http://physionet.org/cgi-bin/ATM</a>

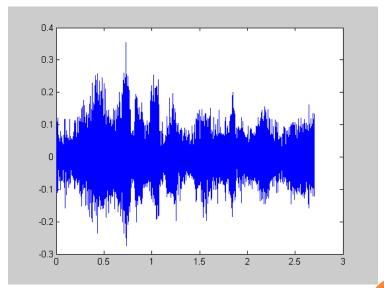
**IECS** 

#### **SET OF SIGNALS**

Although always alone, we survive



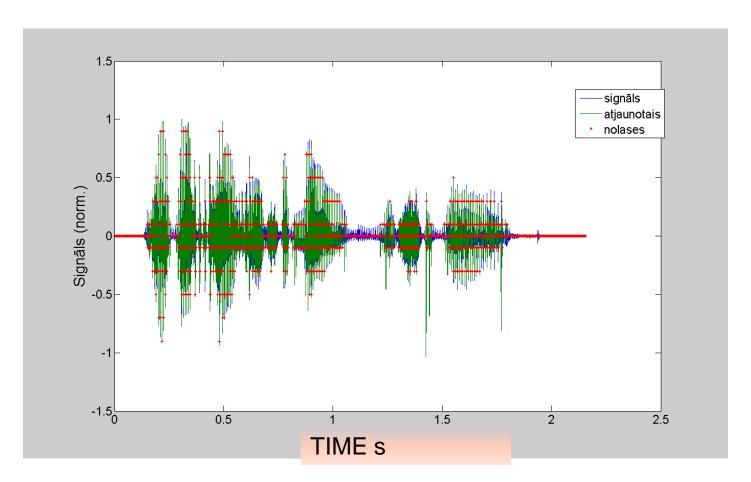




#### COMPARISON

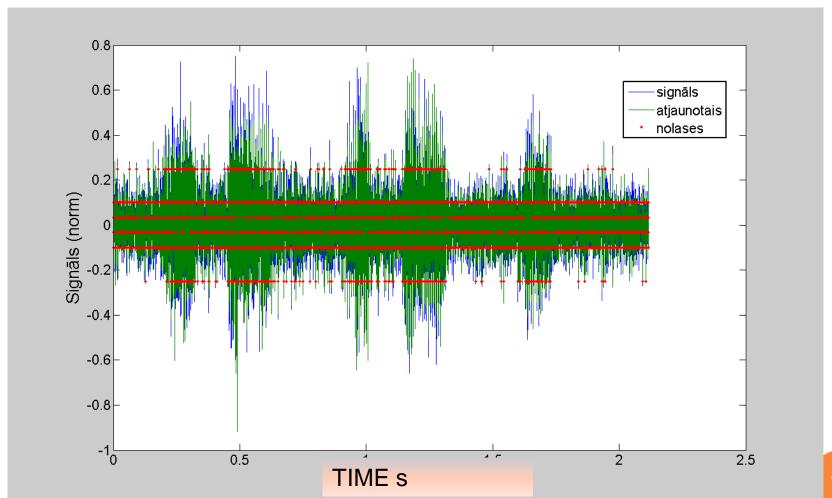
- Resampled uniform input signal is compared with the signal recovered from non-uniformly sampled data using cubic spline function
- Recovered signals using both approaches are compared with input signal
- Quality of recovery is determined calculating and comparing correlation coefficients
- Number of data sampled at different number of reference levels are compared
- Values of signal correlations at different number of reference levels are compared

#### SPEECH SIGNAL SENSING (11 LEVEL SAMPLING)



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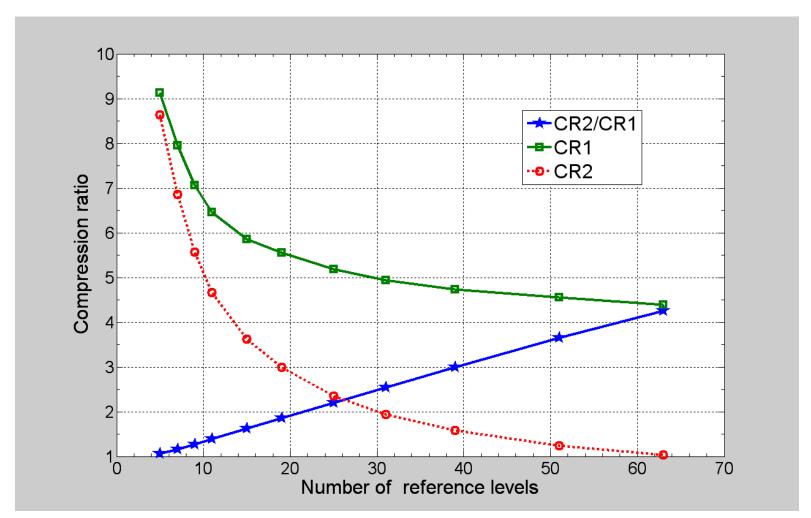
#### AIRPORT NOISE



#### SIGNAL COMPRESSION CALCULATIONS

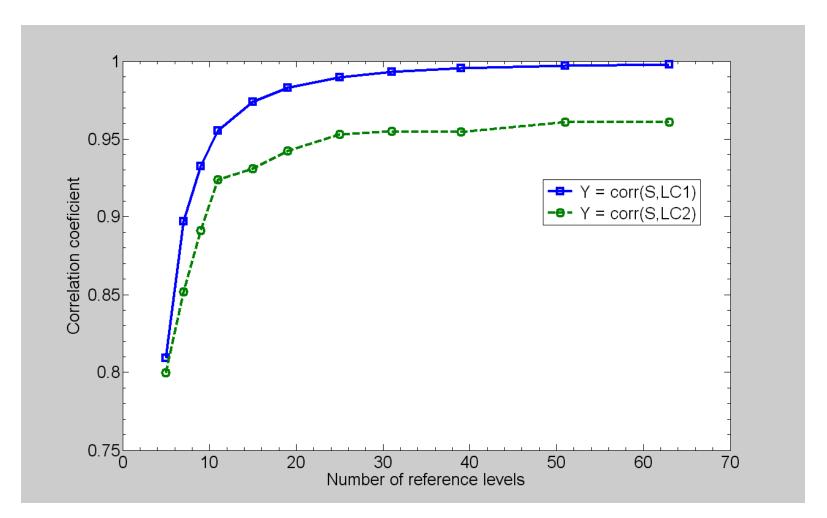
- $\square$  CR1 = Ns/NLC1; CR2 = Ns/NLC2
- Ns number of samples of uniformly sampled data
- NLC1 number of samples of non-uniformly sampled data using sampling approach LC1
- NLC2 number of samples of non-uniformly sampled data using sampling approach LC2
- K = CR2/CR1

#### SPEECH SIGNAL COMPRESSION RATIO

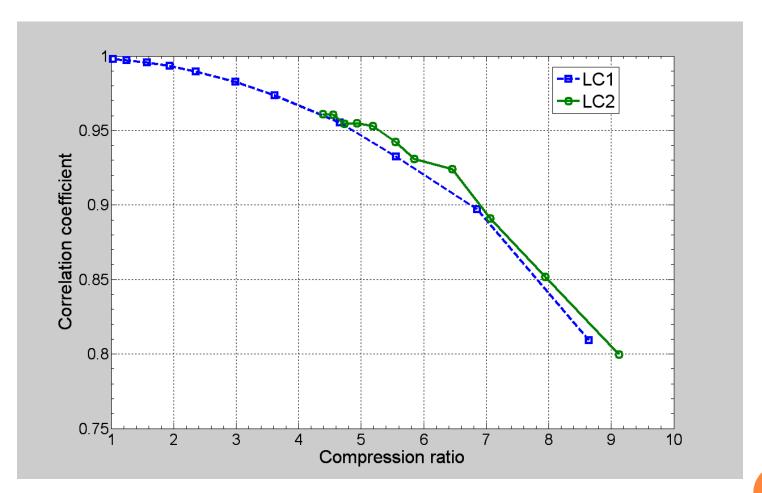


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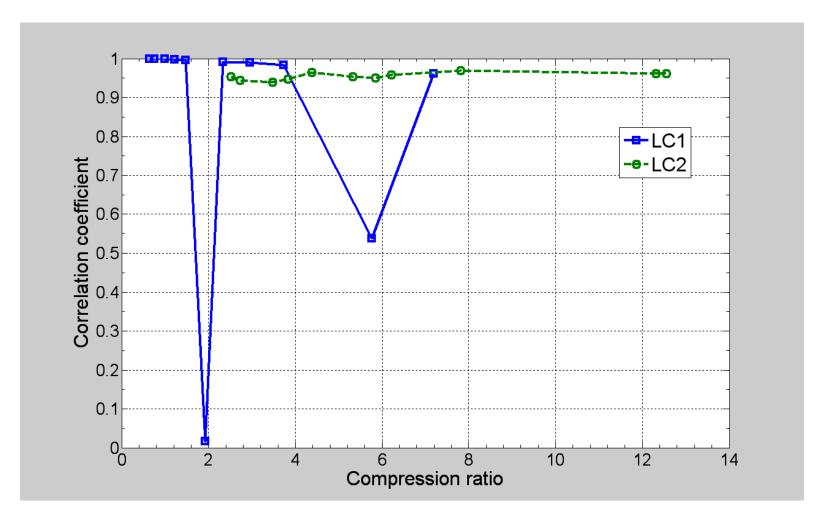
### SPEECH SIGNAL CORRELATION COEFFICIENTS



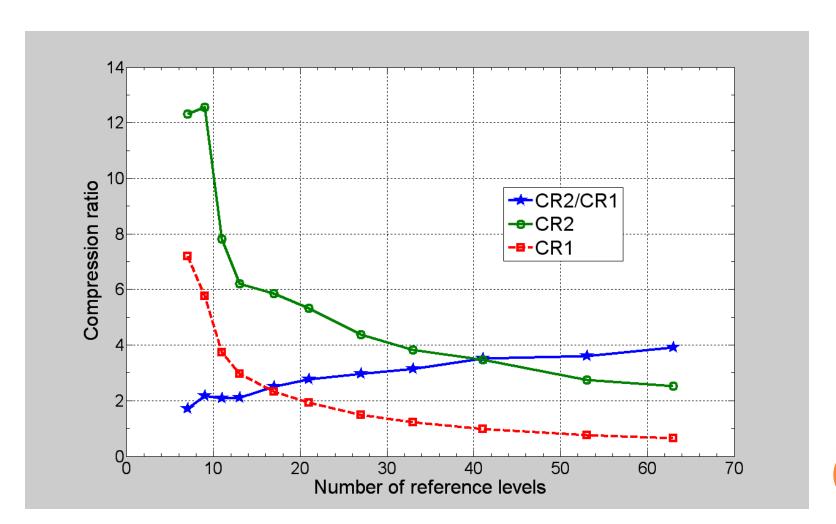
## SPEECH SIGNAL CORRELATION VS COMPRESSION



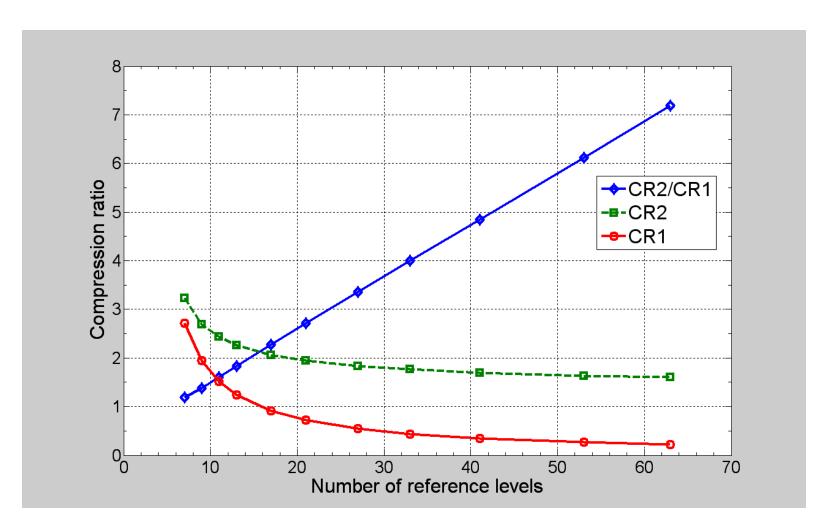
## ECG SIGNAL CORRELATION VS COMPRESSION



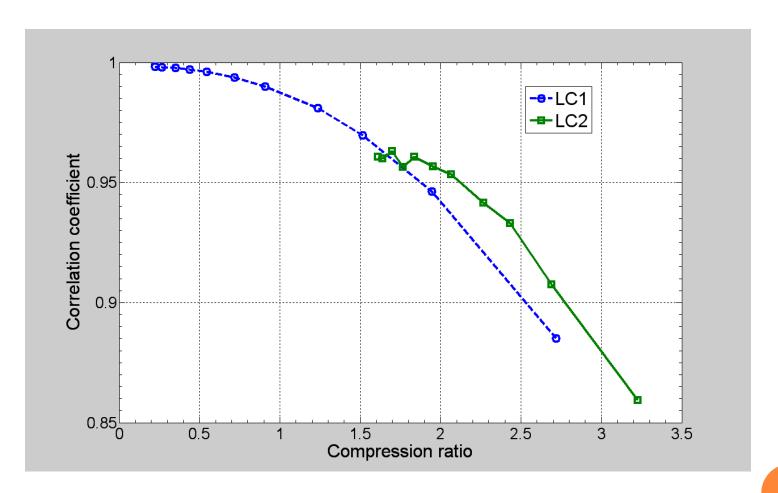
#### **ECG SIGNAL COMPRESSION RATIO**



#### **NOISE SIGNAL COMPRESSION RATIO**



## NOISE SIGNAL CORRELATION VS COMPRESSION



#### CONCLUSIONS

- Depending from the input signal adaptive compressive sensing is compressing data up to 12x
- Maximum compression occurs at small numbers of reference levels
- Modified level crossing approach is more preferable for ECG

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## QUESTIONS Thank You!