

# An Efficient Implementation of the Low-Complexity Multi-Coset Sub-Nyquist Wideband Radar Electronic Surveillance

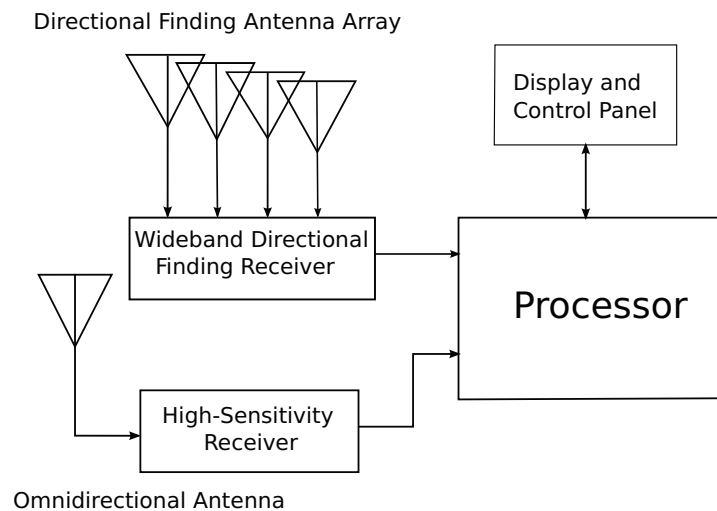
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SSPD, Edinburgh, 9 September, 2014



## Electronic Surveillance (ES)



- **Task:** detecting all RF emitters to identify the presence of threats.
- It has a **passive** monitoring system.
- While Radar ES signals are **very dense**, e.g. can be hundreds of thousands of pulses per second, they have **very sparse** TF representations.
- ES systems can be noise limited, rather than sparsity limited. <sup>2</sup>

## Conventional Radar ES Receivers



- **Instantaneous Frequency Measurements:** limited spectral sensitivity.
- **Rapid Frequency Sweeping ADC's:** limited temporal sensitivity.
- **Wideband Analog to Digital Converters:** need multi GHz ADC's.
- **Proposal:** Sub-Nyquist Analog to Information Converter.<sub>3</sub>

## Sub-Nyquist Sampling

- **Why?**

- ① Sampling at the rate of Nyquist is **difficult** or **costly** in some applications, e.g. Wideband ADC's and Wideband Digital Receivers.
- ② It is a **waste of resources**, if we sample at a rate, much higher than the information rate.
- ③ An **application specific** sampling strategy, *i.e.* exploring signal structures.

- **How?**

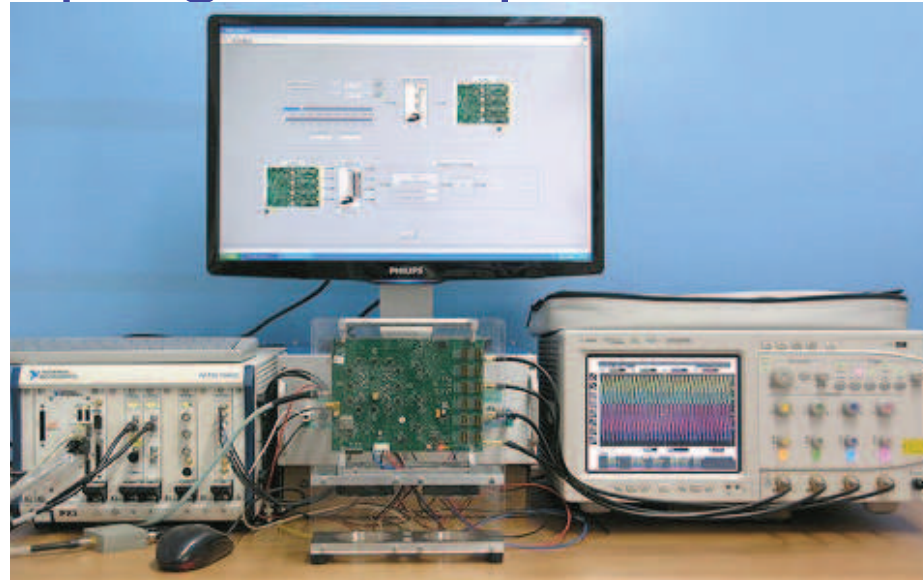
- ① Using underlying signal structures, e.g. sparsity.
- ② Incorporating non-uniform sampling (random?) in the sensing framework.
- ③ Non-linear reconstruction of signals.

## Sub-Nyquist Sampling, cont

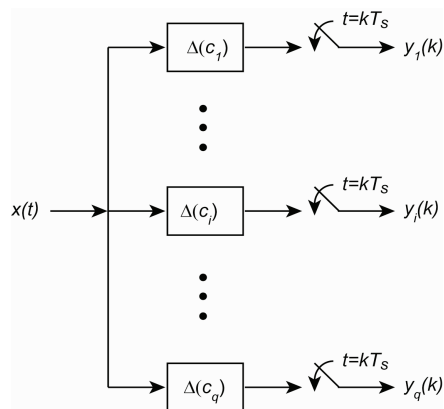
- **Challenges?**

- ① *Analog Hardware*: How efficiently can we design the analog part?
- ② *Computational Complexity*: How efficient can we implement the non-linear recovery algorithm?
- ③ *Noise Sensitivity*: Sensitivity to the input noise?
- ④ *Robustness*: How much the sub-Nyquist algorithm is sensitive to the **signal model mismatch** and **circuit design tolerances**.

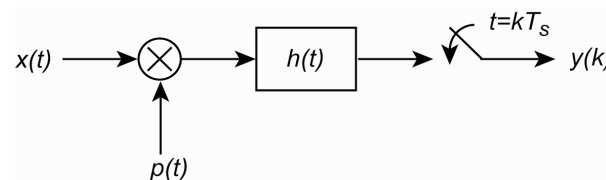
# Sub-Nyquist Sampling Techniques



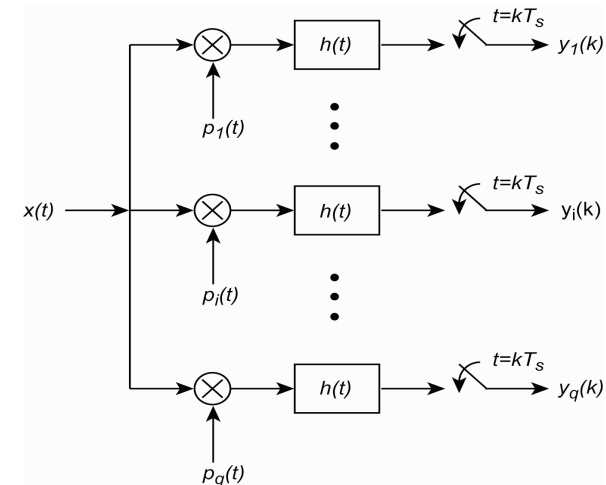
Technion Modulated Wideband Converter Demonstrator



Multi-coset Sampling  
(Feng&Bresler 1996)



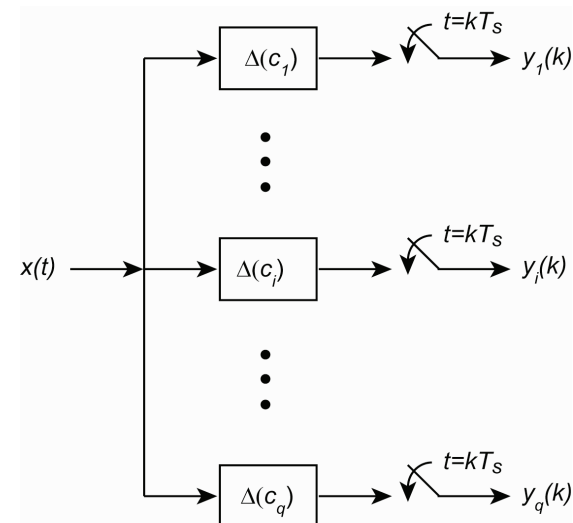
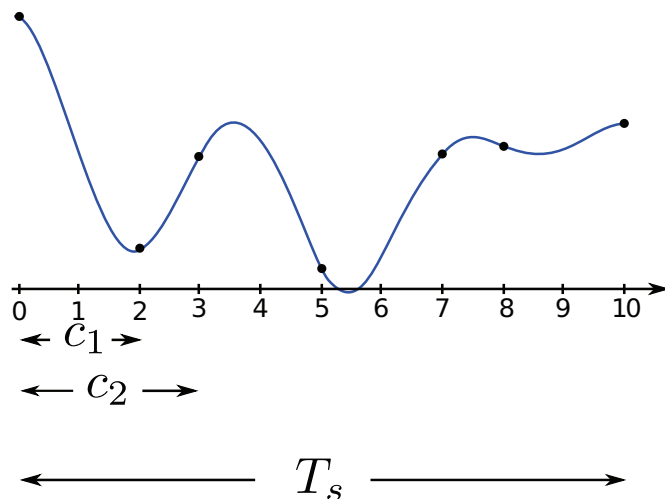
Random Demodulator  
(Triopp et al. 2007)



Modulated Wideband Converter  
(Mishali and Eldar 2010)

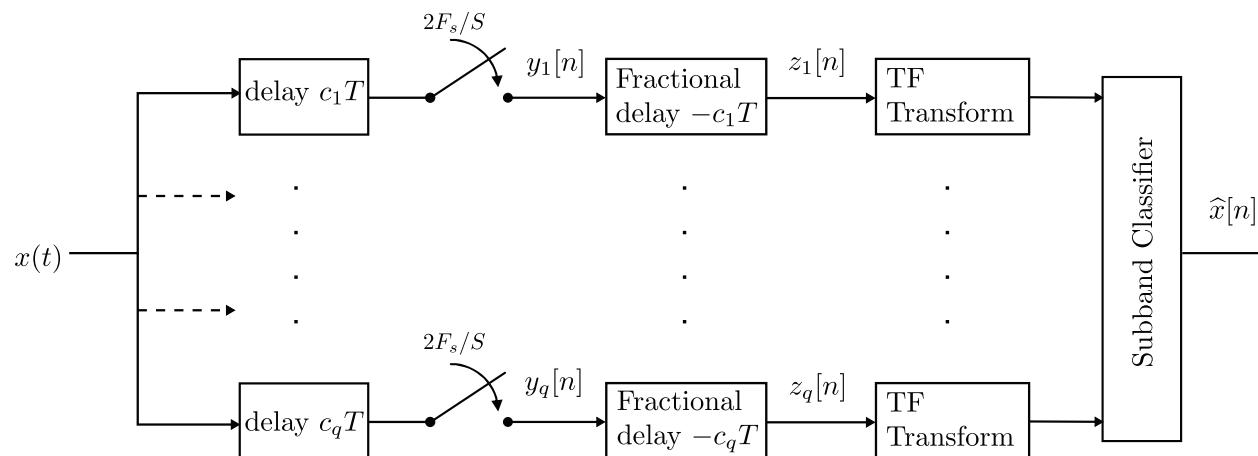
## Multi-coset Sampling Framework

- **Non-uniform** sampling technique [Feng and Bresler, 1996].
- Sparse multiband signal model.
- A **subspace method** for reconstruction by Feng et al.
- A **convex optimisation** problem for reconstruction by [Mishali and Eldar 2009].



## Proposed Sub-Nyquist Sampling Framework

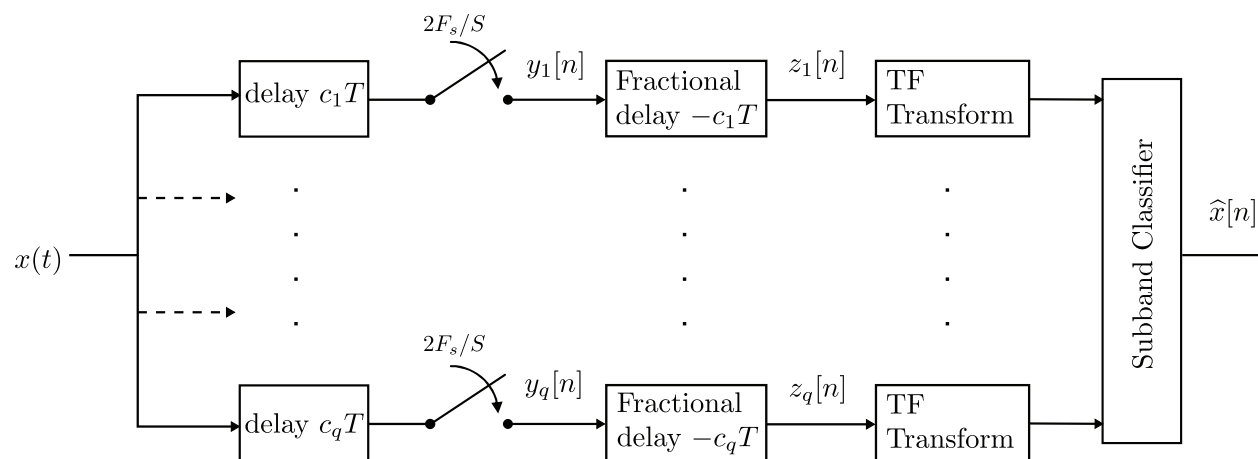
- A Multi-coset sampling strategy.
- Avoiding any complicated operations *e.g.* SVD,  $\ell_1$  minimisation.
- The signal model has to fit into the Radar ES.



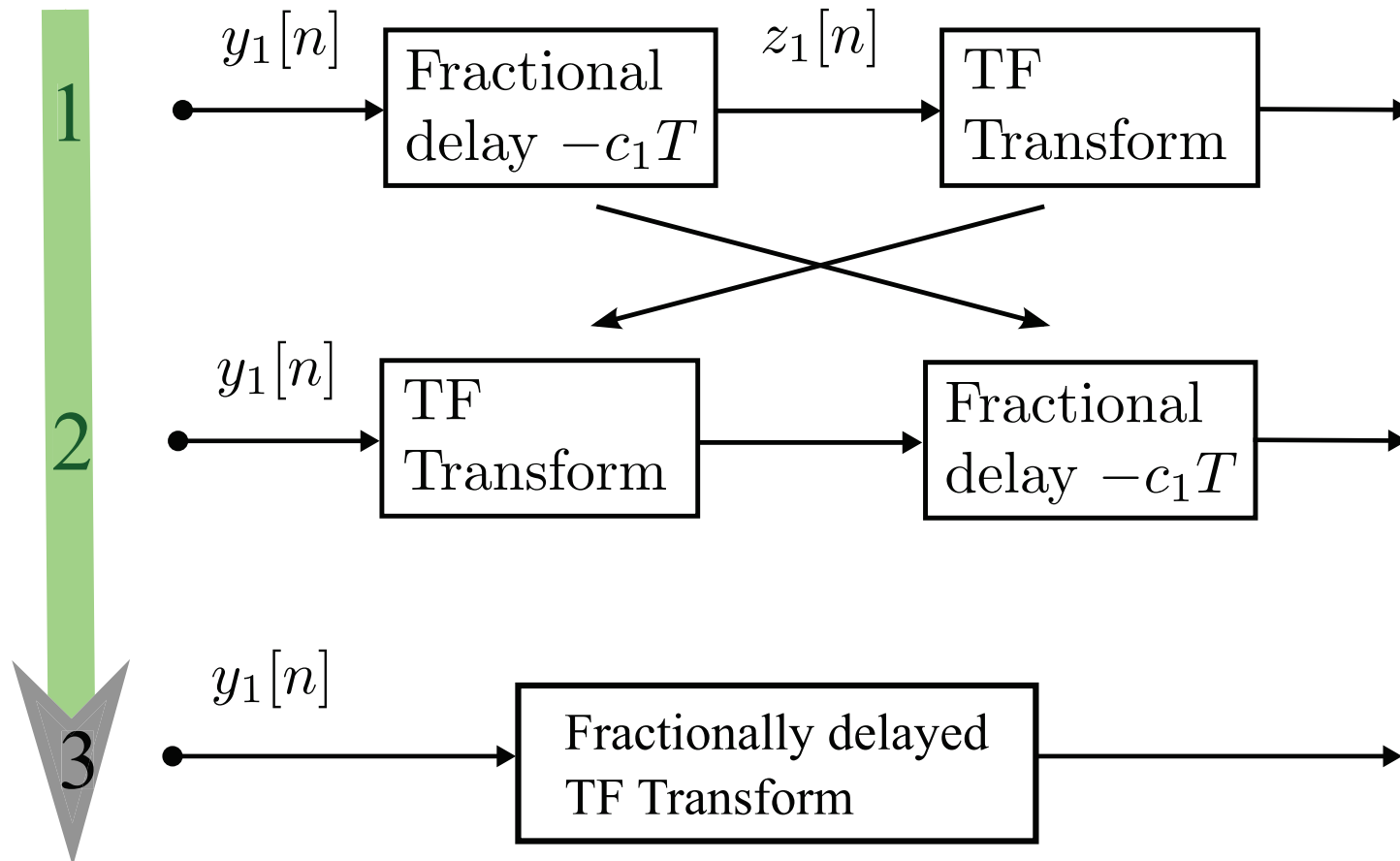


## Components of Proposed Framework

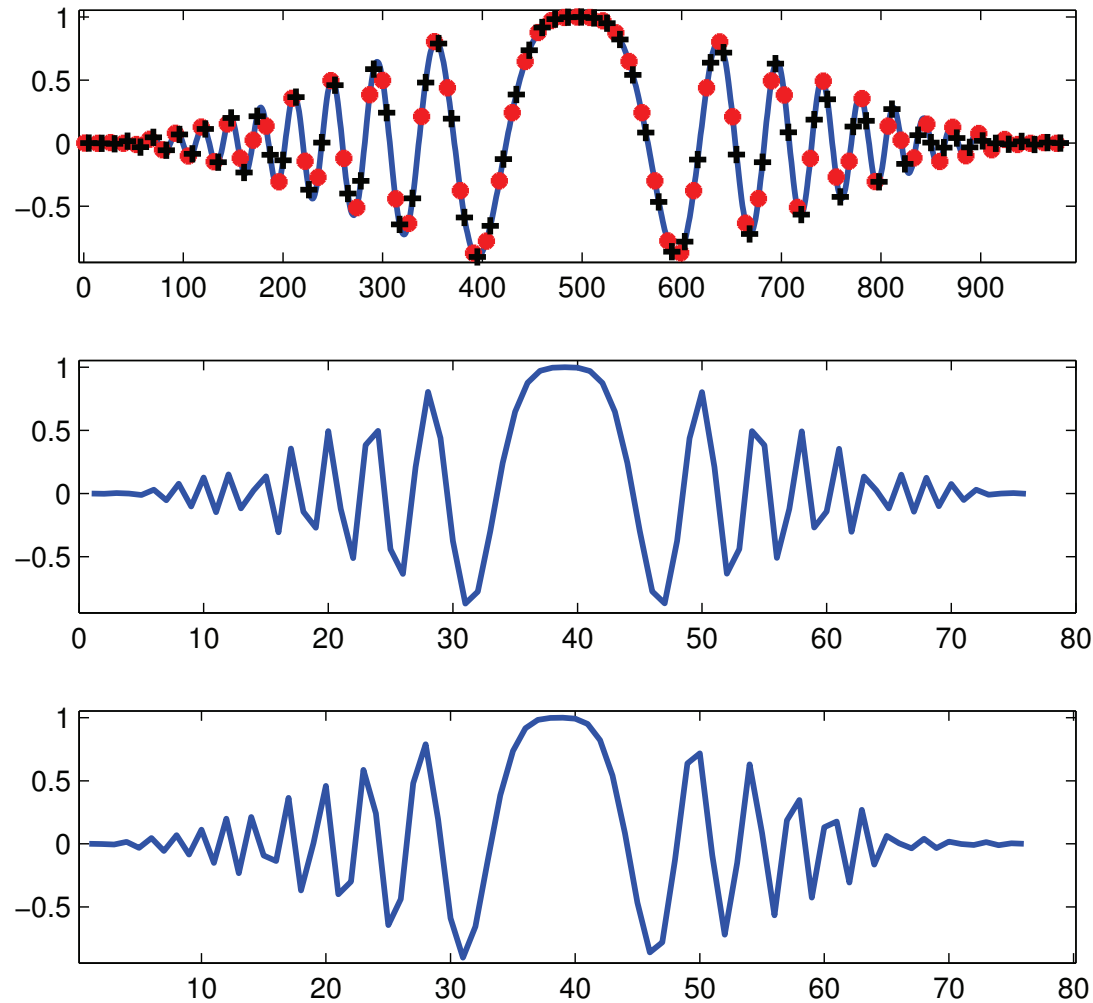
- *A bank of multi-coset channels:* it has distinguished delays.
- *Digital Fractional Delay (DFD) filters.*
- *Time-Frequency transform:* STFT has currently been used.
- *Subband Classifier:* Composed of a linear operator (Harmonic Frame), followed by a simple maximum-absolute value operator.



## Digital Fractional Delay Implementation

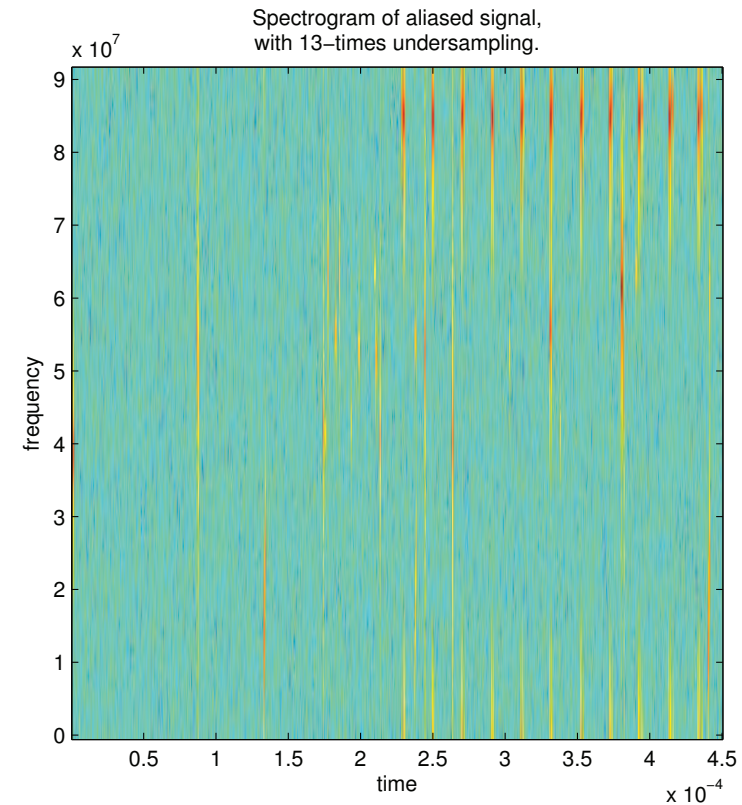
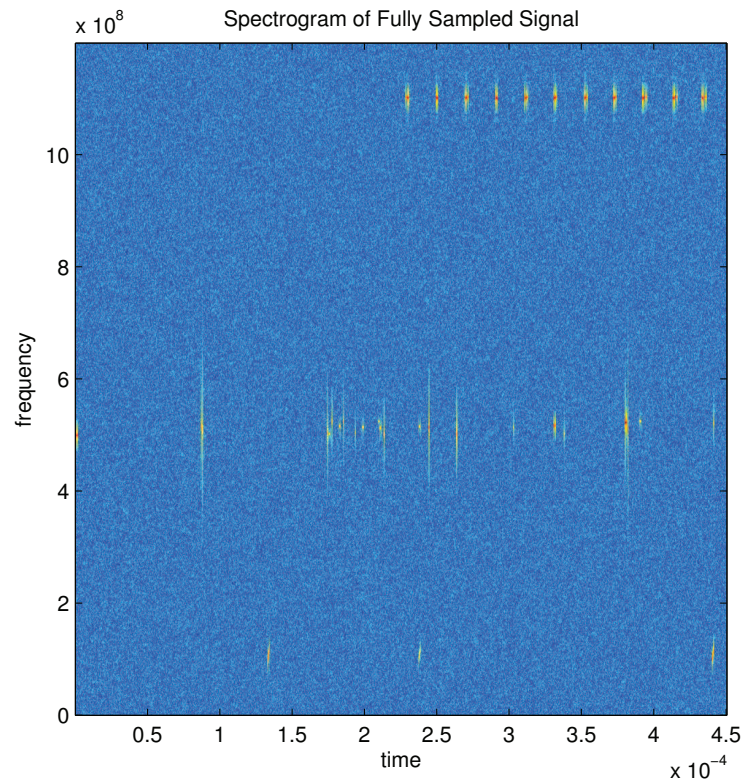


## Discretisation of Time-Frequency Kernel



## Assumptions and Properties

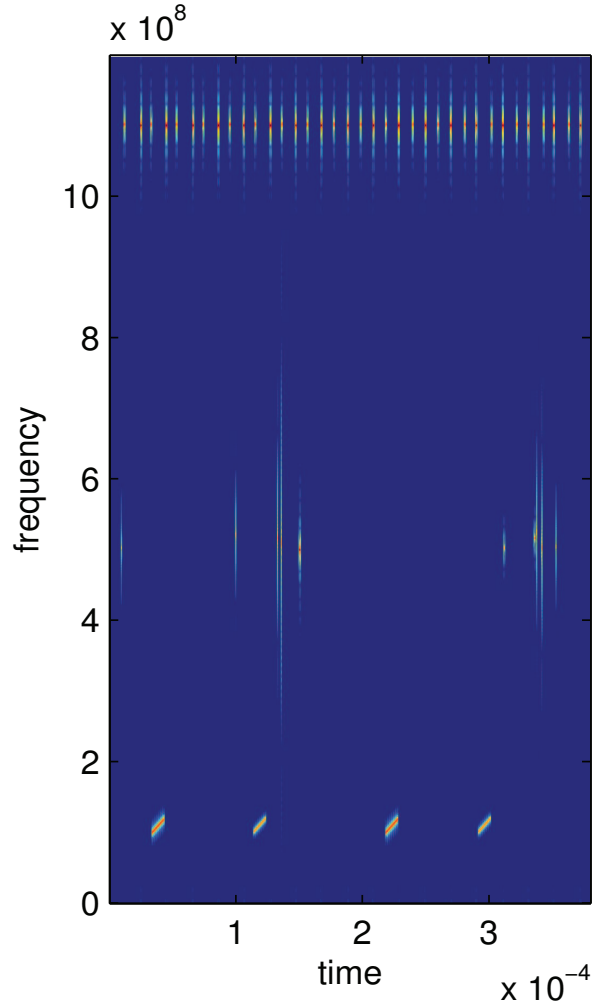
- **Approximate Disjoint Aliased Support:** different to sparsity.



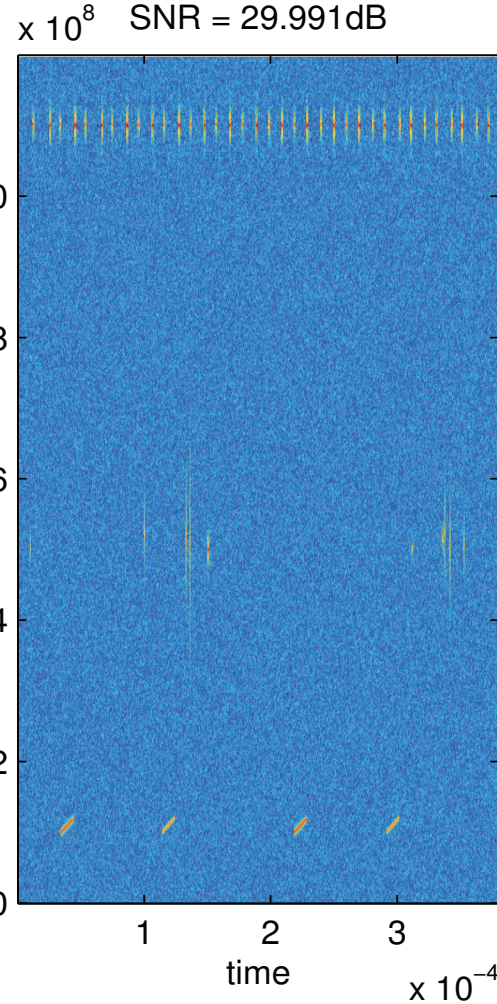
- **No random sampling:** optimal delay parameters from a Harmonic Equiangular Tight Frame (HETF).
- **No DFD filter:** absorption into TF transform.

## Evaluation with Radar ES signals

Spectrogram of Clean Signal.

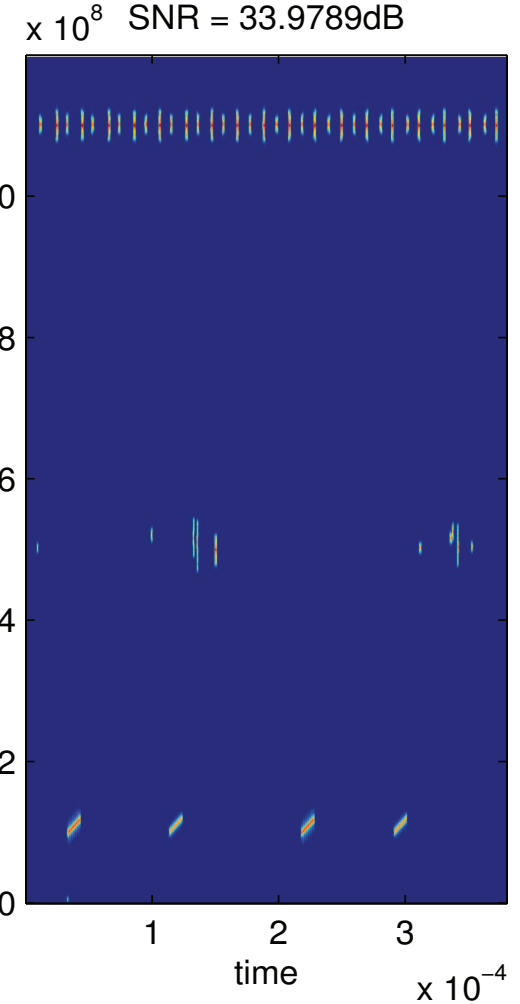


Spectrogram of Noisy Signal,

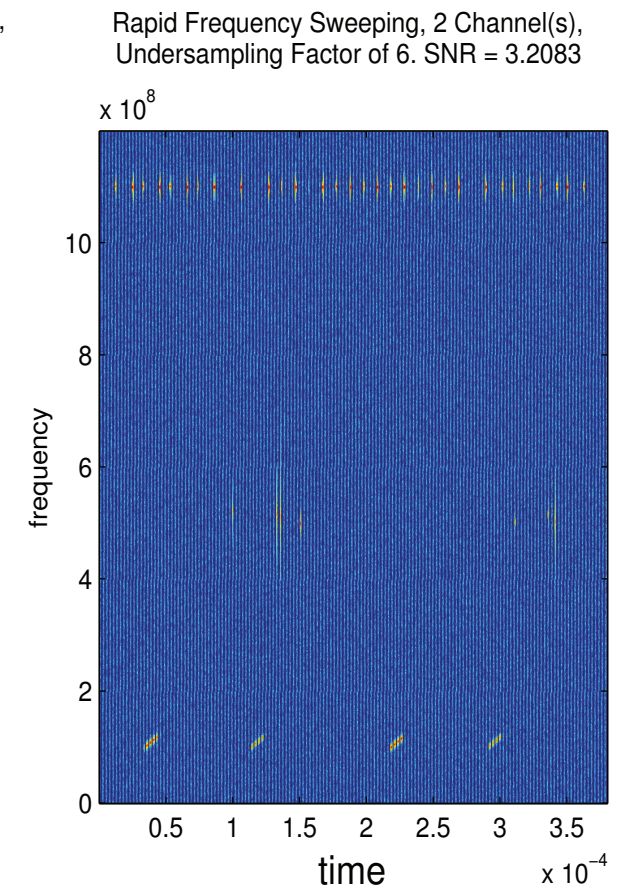
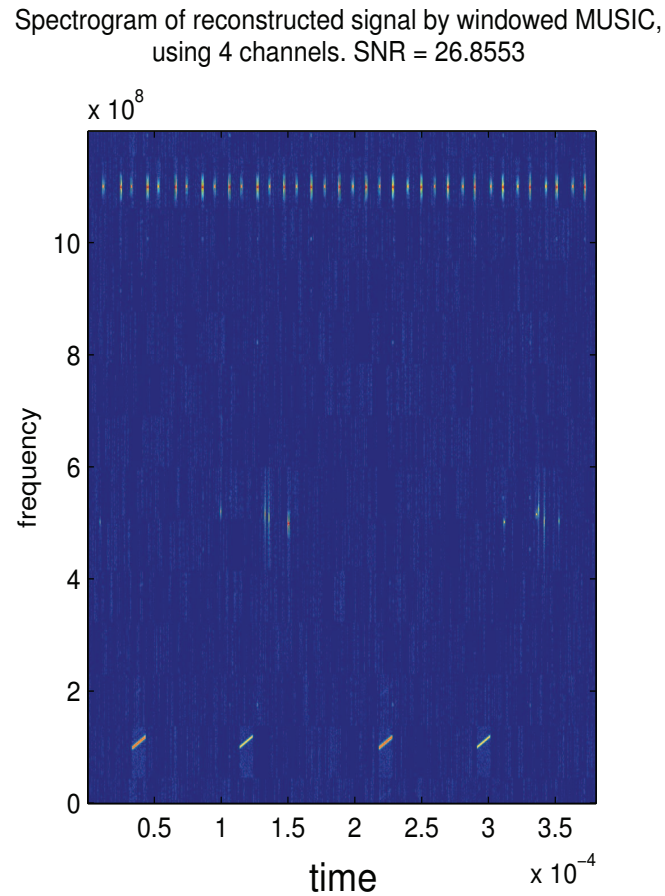
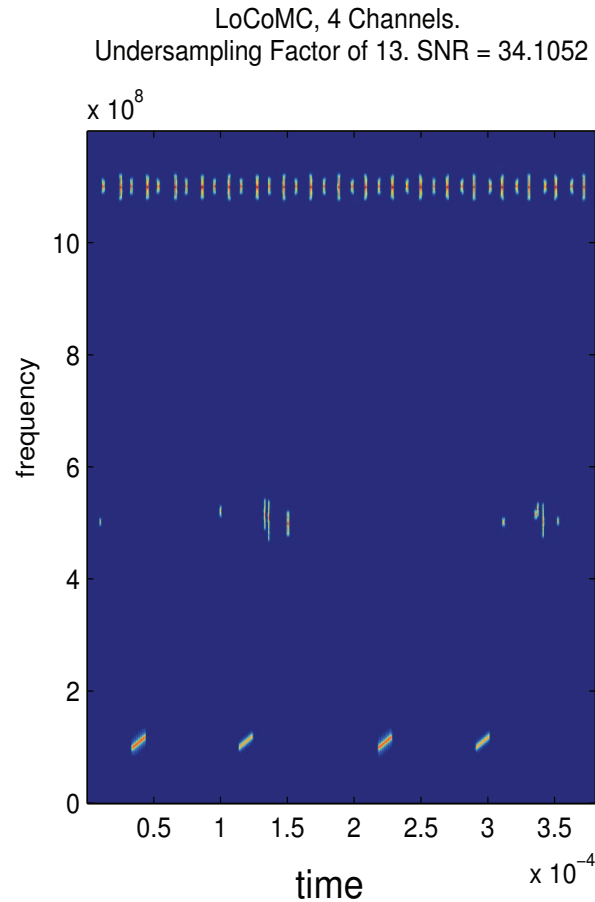


LoCoMC, using

4 of possible 13 channels.

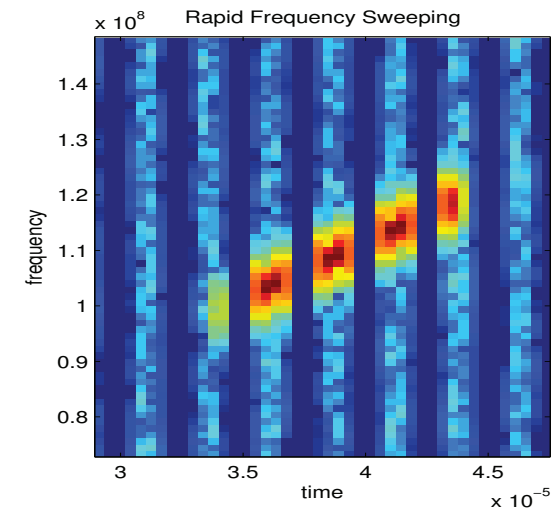
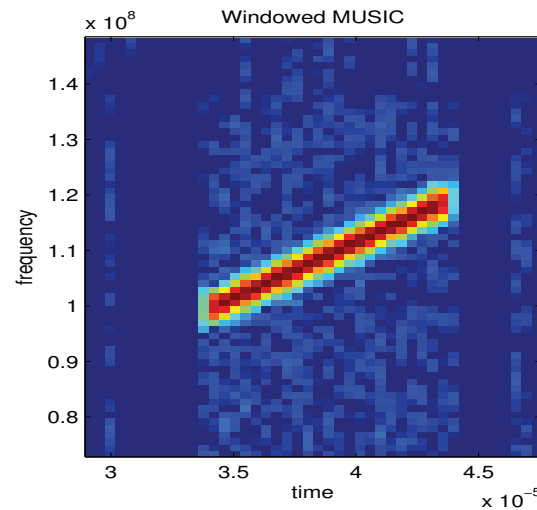
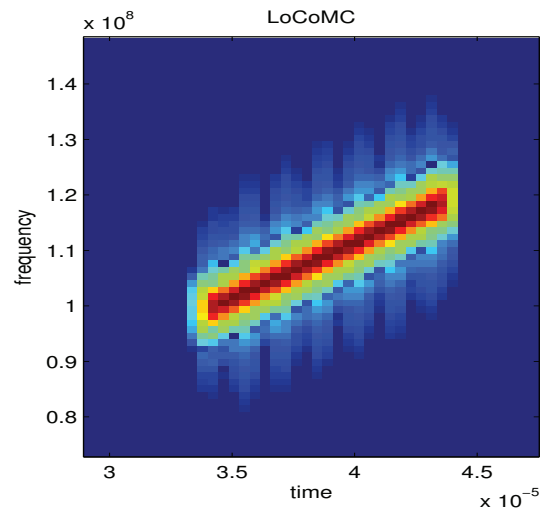
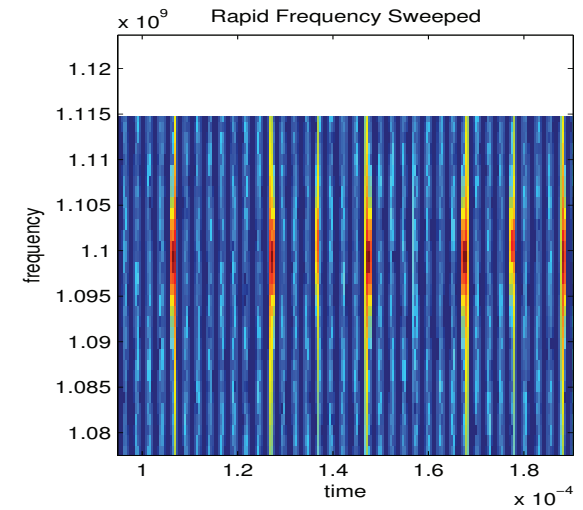
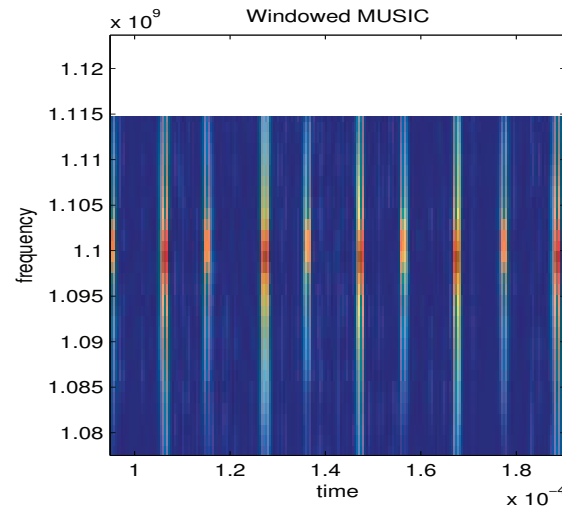
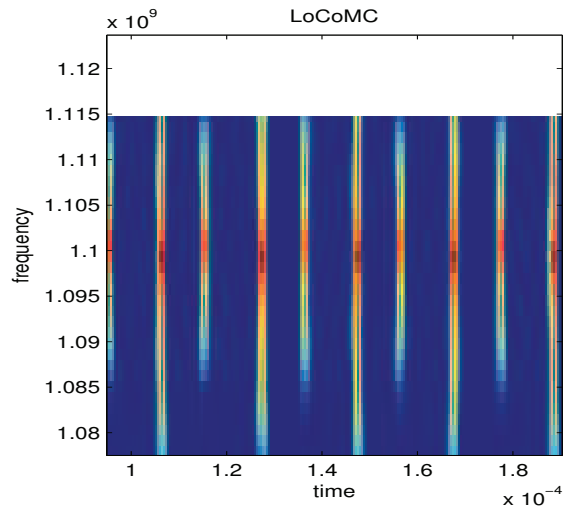


## Comparison with Other Methods



- Two overlapping ADC's with  $1/6$  of Nyquist sampling rate for RFS method.

# Comparison with Rapid Frequency Sweeping



## LoCoMC at a Glance:

- **Pros:**

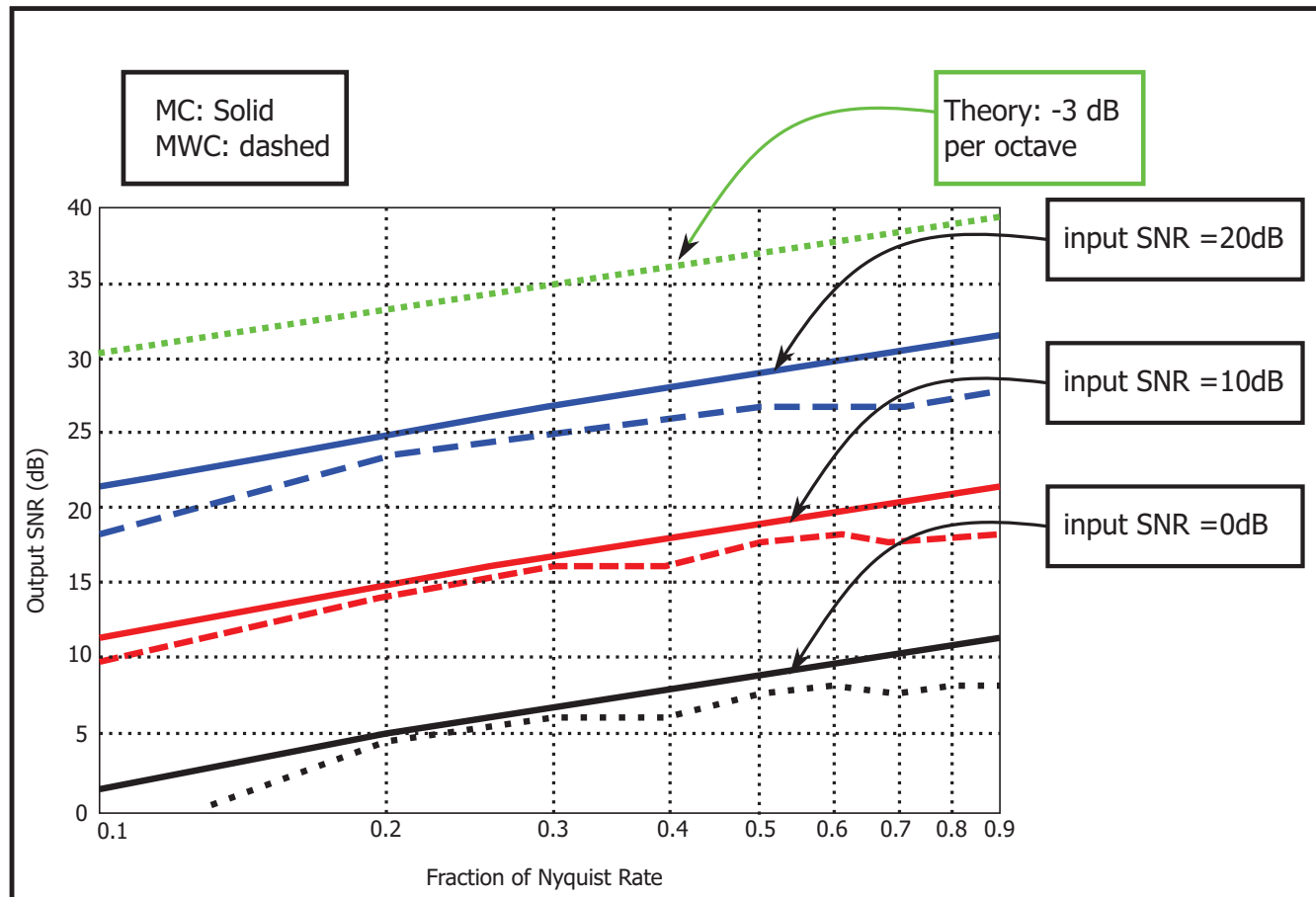
- **Non-iterative:** it may be pipelined.
- Can use only a **few** Multi-coset channels, *e.g.* as few as  $q = 2$ .
- Uses a different signal model, *i.e.* **ADAS**, which matches well to some classes of signals, *e.g.* Radar ES.
- **Large Dynamic Range**, *e.g.* 70 dB, which makes it suitable for the low probability of intercept signals.
- **Continuously monitoring** wideband RF signals, in a contrast with the rapid frequency sweeping technique.

- **Cons:**

- Needs a **Fast** “sampler”. The “holder/tracker” can be slow.
- **Noise folding:** 3 dB processing gain loose per octave. A characteristic of sub-Nyquist sampling techniques.



# Noise Folding in Sub-Nyquist Sampling



## Conclusion and Future Work

- **Conclusion:**

- A low SWAP algorithm for Radar ES receiver.
- Exploring parsimonious structure of ES signals.
- When ES signals are ADAS, the signal recovery is guaranteed.
- Outperforms the MUSIC recovery algorithm in the given ES signals.

- **Future work:**

- CFAR analysis for parameter selection.
- Pulse descriptor word extraction.
- Sensitivity and robustness analysis.

We gratefully acknowledge the support from:



Thanks for your attention.

