

# Sub-Nyquist Cognitive Radio

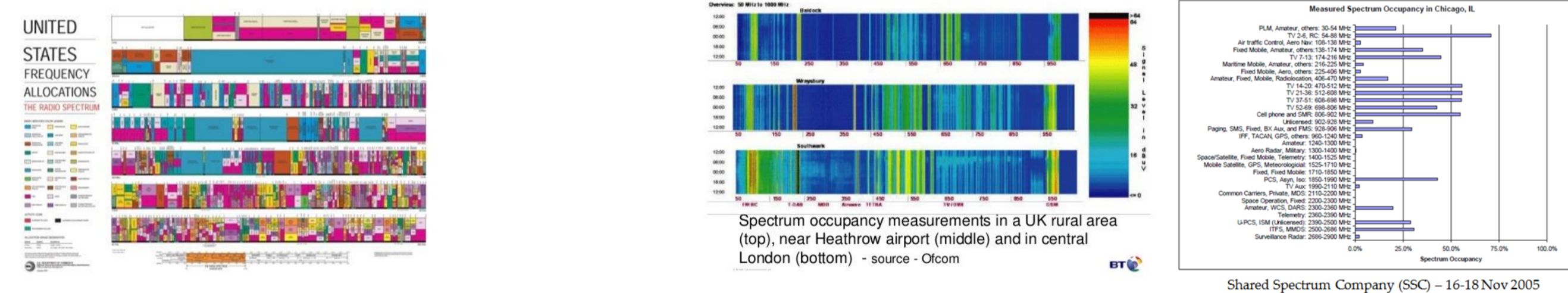
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## Contributions

- Spectrum sensing from sub-Nyquist samples for Cognitive Radios based on the modulated wideband converter (MWC):
  - Cyclostationary detection: increase robustness to noise
  - Collaborative spectrum sensing: overcome fading and shadowing effects
  - Joint spectrum sensing and DOA estimation: increase efficiency
- Hardware prototype system

## Cognitive Radio (CR): Between Sparsity and Scarcity

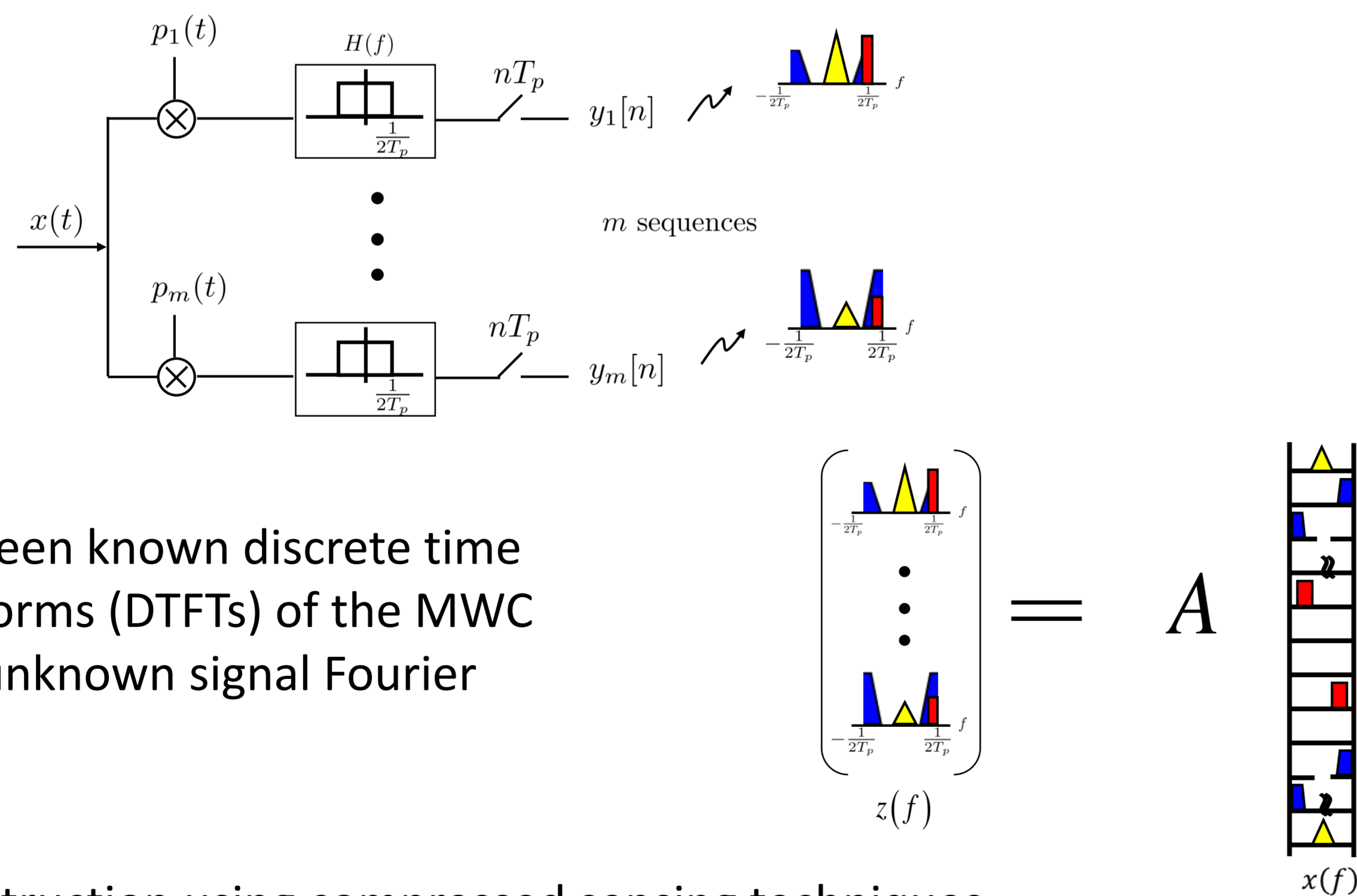
- Address the conflict between spectrum saturation and underutilization
- Grant opportunistic access to spectrum "holes" to unlicensed users
- Perform spectrum sensing task efficiently, in real-time and reliably



- Nyquist sampling is not an option  $\Rightarrow$  sub-Nyquist sampling
- Joint DOA estimation and spectrum sensing increase CR efficiency

## MWC Sampling scheme

- Multiband model:  $M$  signals with max. bandwidth  $B$  and max. frequency  $f_{Nyq}$
- Analog front-end: aliases the spectrum so that each band appears in baseband



- Relation between known discrete time Fourier transforms (DTFTs) of the MWC samples and unknown signal Fourier transform:

$$\begin{bmatrix} Y_1(f) \\ \vdots \\ Y_m(f) \end{bmatrix} = A z(f)$$

- Signal reconstruction using compressed sensing techniques

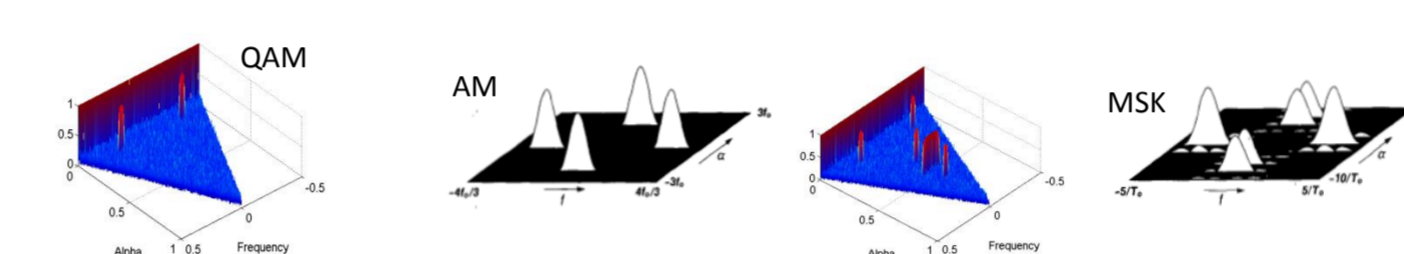
**Goal: increase robustness to noise, fading and shadowing effects, and allowing for joint DOA estimation and spectrum sensing**

## Cyclostationary Detection

- Cyclic spectrum measures the correlation between two frequency-shifted versions of  $x(t)$  as

$$S_x^\alpha(f) = \mathbb{E} \left[ X \left( f + \frac{\alpha}{2} \right) X^* \left( f - \frac{\alpha}{2} \right) \right]$$

**Cyclic spectrum exhibit spectral peaks at frequency locations that depend on carrier frequencies and bandwidths**



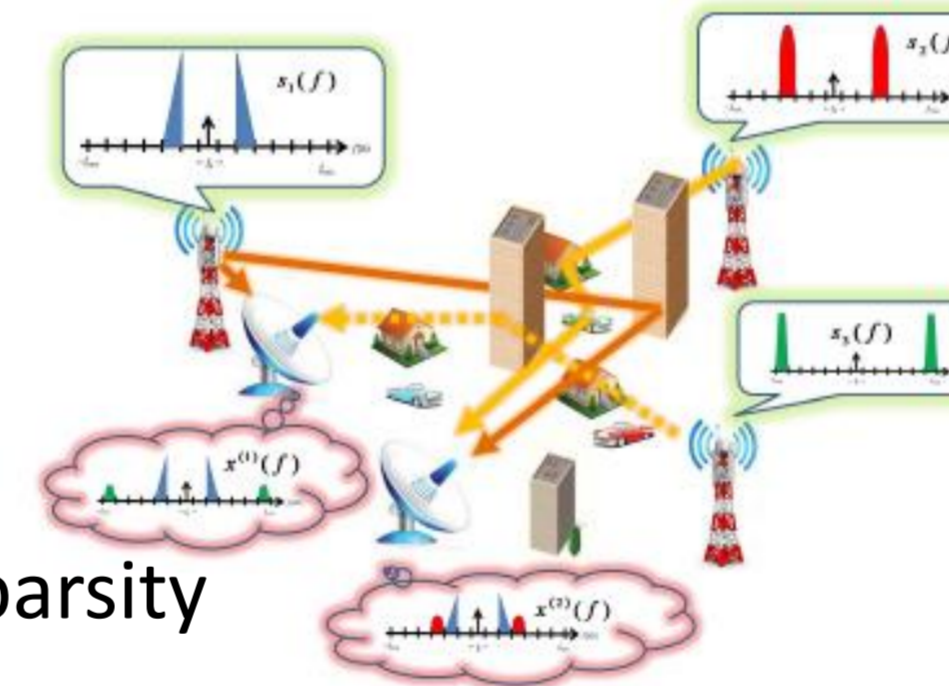
- Recover cyclic spectrum from MWC sub-Nyquist samples by computing the correlation of frequency-shifted versions of the samples
- Estimate transmissions bandwidth and carrier frequencies from reconstructed cyclic spectrum



**Cyclostationary detection outperforms energy detection in low SNR regimes**

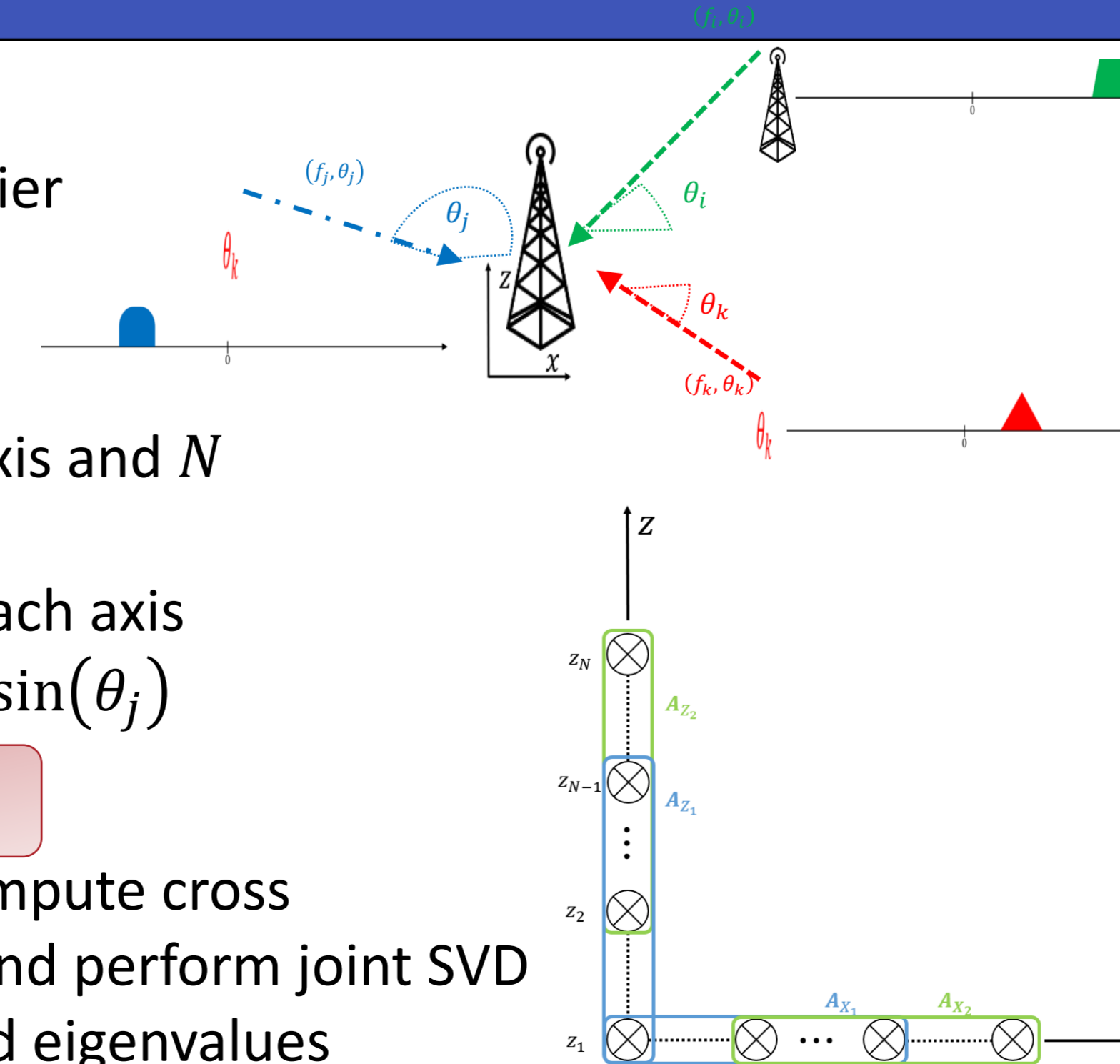
## Collaborative Spectrum Sensing

- Problem: fading and shadowing effects
- Proposed solution: collaborative spectrum sensing
- Centralized** approach:
  - Each CR sends measurements to a fusion center
  - Goal: recover joint support at the fusion center
  - Extension of CS algorithms to account for joint sparsity
- Distributed** approach:
  - A vector is shared within the network through random walk
  - Goal: recover joint support within the network
  - Random distributed IHT: derived and proved to converge to true solution



## Joint Spectrum Sensing and DOA estimation

- Each transmission  $s_i(t)$  is characterized by a DOA  $\theta_i$  and carrier frequency  $f_i$
- L-shape ULA with  $N$  sensors in  $x$  axis and  $N + 1$  sensors in  $z$  axis:
  - Naïve approach: apply ESPRIT in each axis separately: estimate  $f_i \cos(\theta_i)$  and  $f_i \sin(\theta_i)$
- Pairing problem**
  - To overcome pairing problem, compute cross correlation matrices between ULAs and perform joint SVD
  - Compute  $\theta_i$  and  $f_i$  from the paired eigenvalues



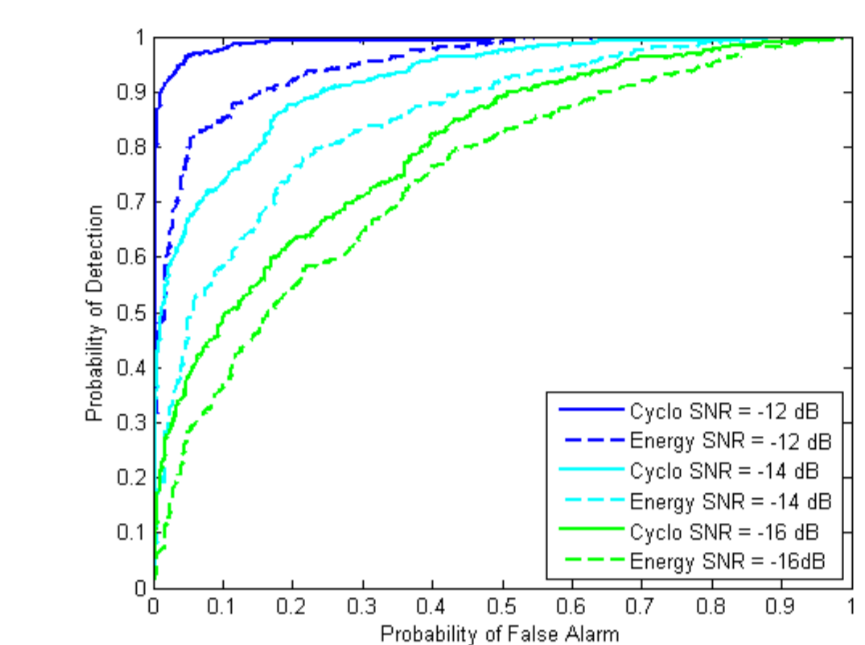
## Simulation Results

- Cyclostationary detection

Exemplary Results

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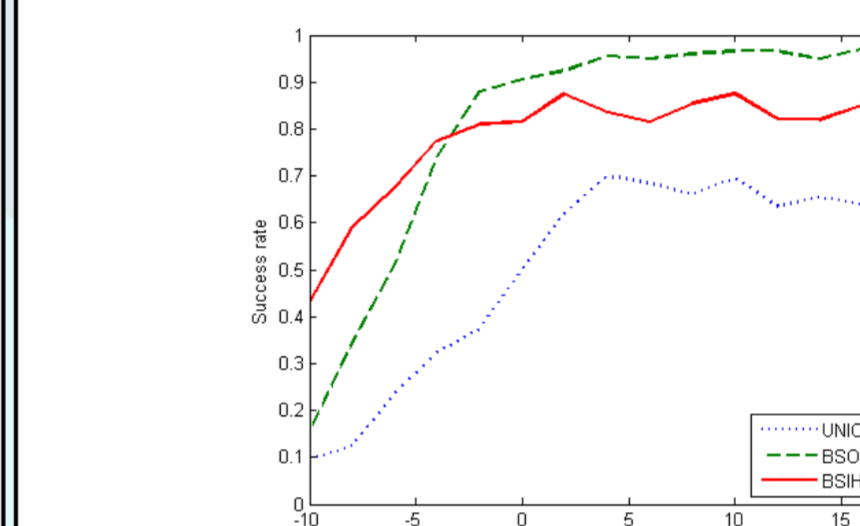
Transmission Table
-----
3 Signals Transmitted
Carrier Frequency = 255.71642 2666.6566 3047.6438 (MHz)
Bandwidth = 10 (MHz)
Modulation = QPSK
3 Signals Detected
Carrier Frequency = 255.72051 2667.3551 3048.4051 (MHz)
Bandwidth = 9.94541 10.00528 9.94541 (MHz)
Modulation = QPSK
    
```



Nyquist rate	10 GHz
Sampling rate	1.09 GHz
Transmissions	3 BPSK

11% Nyquist rate

- Collaborative spectrum sensing

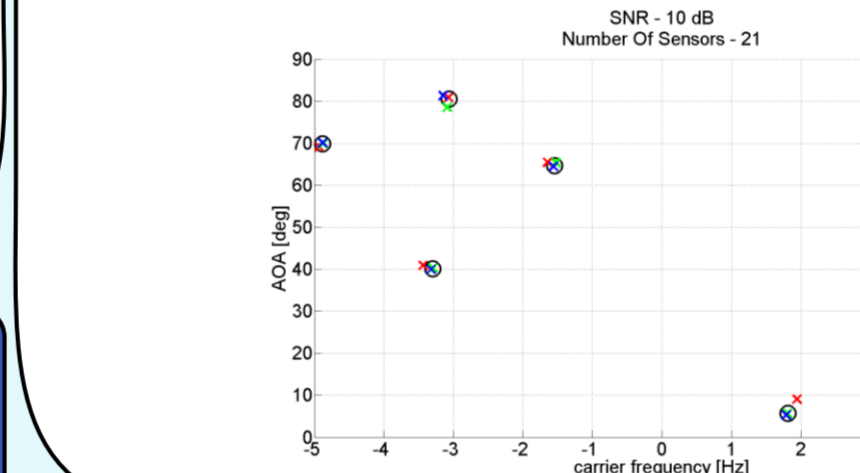


Nyquist rate	6.1 GHz
Sampling rate	360 MHz
Transmissions	3 QPSK

6% Nyquist rate

Left: centralized  
right: distributed

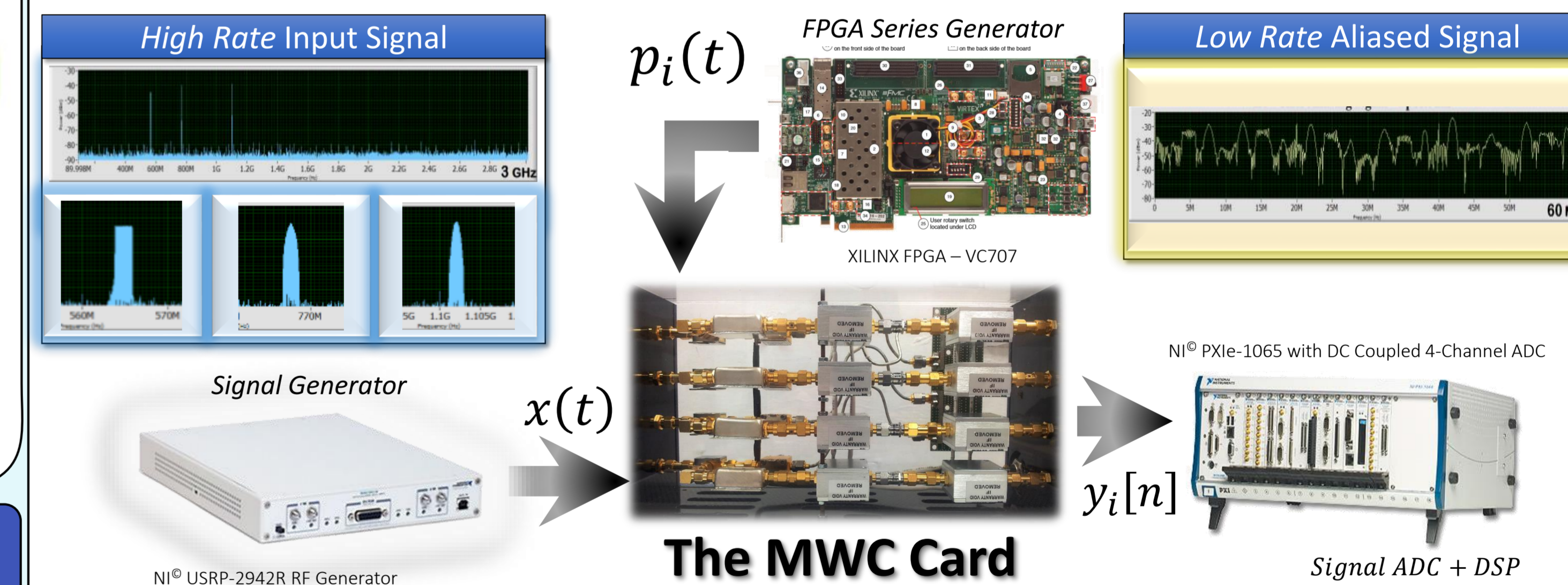
- Joint DOA and spectrum sensing



Nyquist rate	10 GHz
Sampling rate	1.05 GHz
Transmissions	7 (left), 3 (right)

11% Nyquist rate

## Hardware Prototype



- Proprietary MWC card mixes with input with the mixing sequences
- Input is generated live by National Instruments USRP-2942R
- Entire digital processing is done under LabVIEW environment
- Input signal Nyquist rate – 6GHz
- Sub-Nyquist sampling rate – 3\*120MHz
- Just 6% of Nyquist rate**

## References

- [1] M. Mishali and Y. C. Eldar, "From theory to practice: Sub-Nyquist sampling of sparse wideband analog signals," IEEE Journal of Selected Topics in Signal Processing, 2010
- [2] A. Paulraj, R. Roy, and T. Kailath, "Estimation of signal parameters via rotational invariance techniques - ESPRIT," Information Systems Laboratory, 1986
- [3] D. Liu and J. Liang, "L-shaped array-based 2D DOA estimation using parallel factor analysis," WCICA, 2010