



Adaptive Demodulation Techniques for Next Generation Software Defined Radios

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Contents

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- Modulation classification overview
- Research on commercial applications
- Challenges



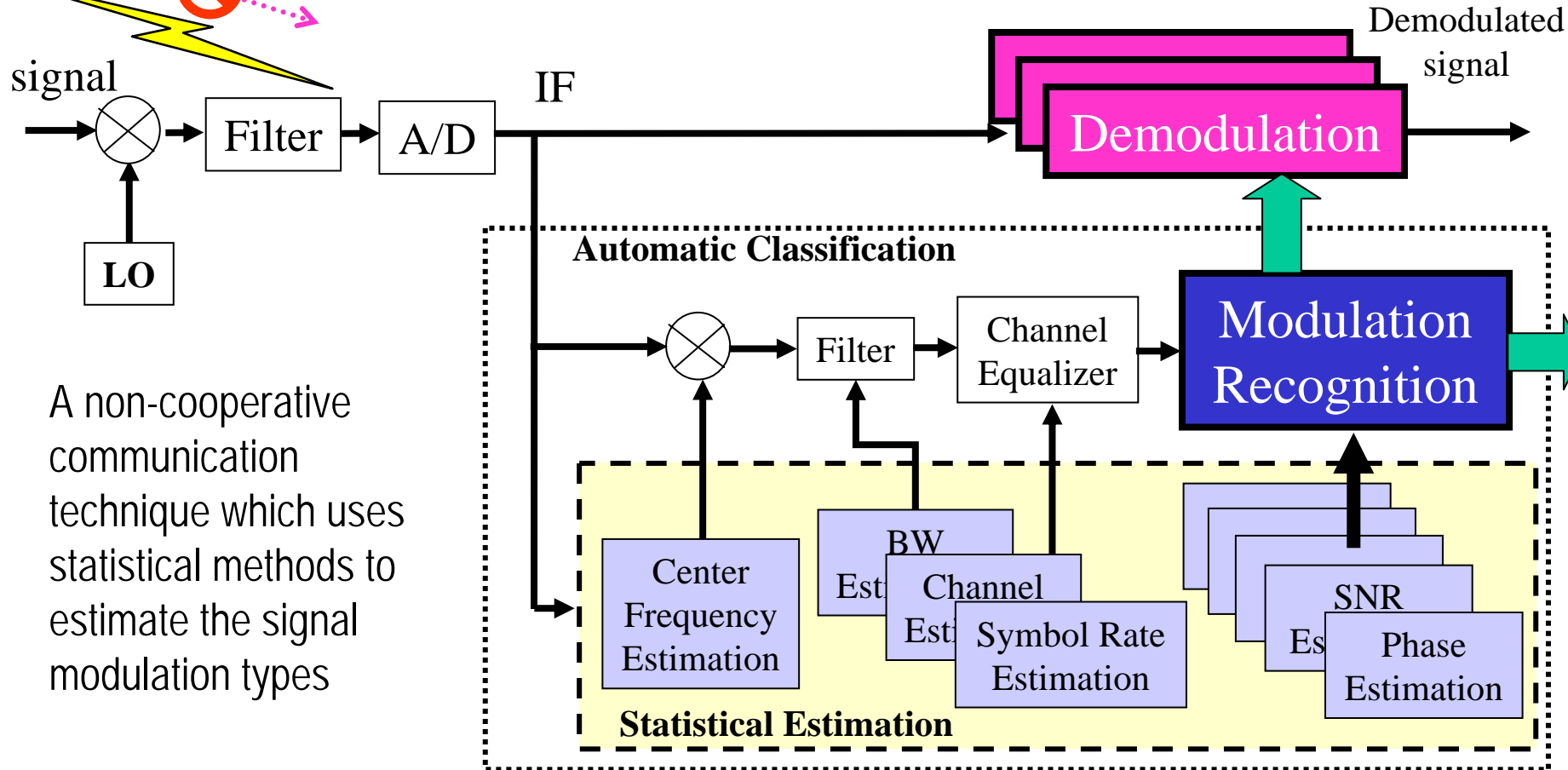
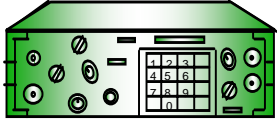
Modulation Classifier



From: <http://www.ottawa.drdc-rddc.gc.ca>



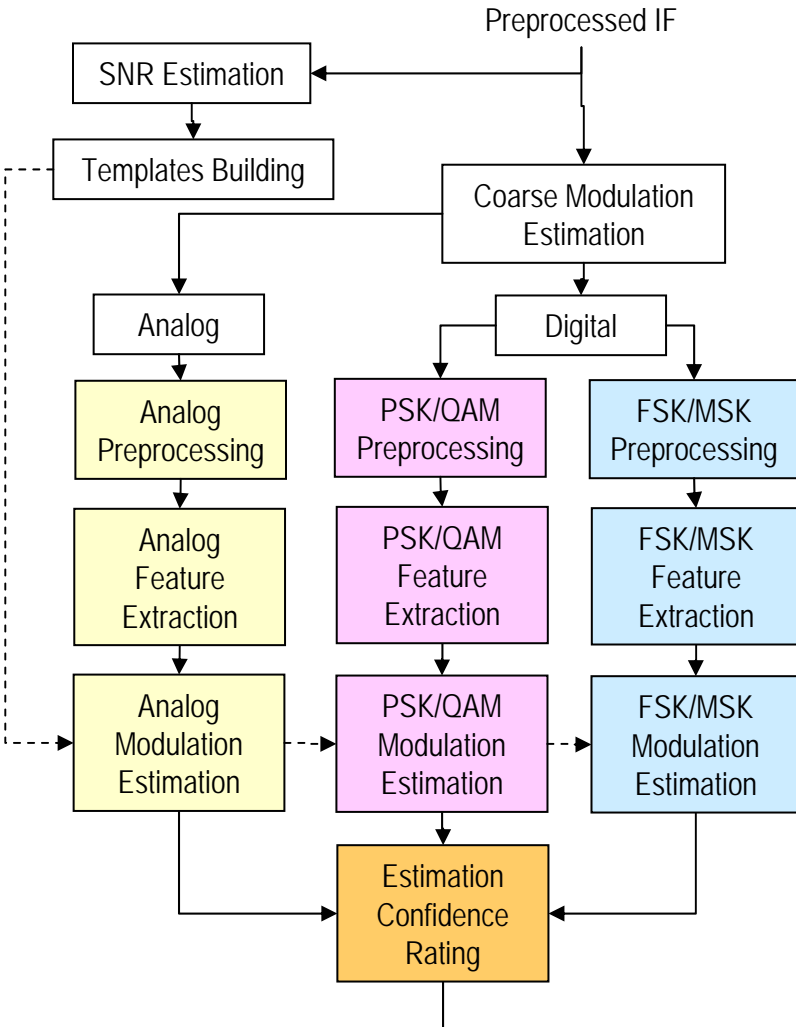
What is Automatic Modulation Classification ?



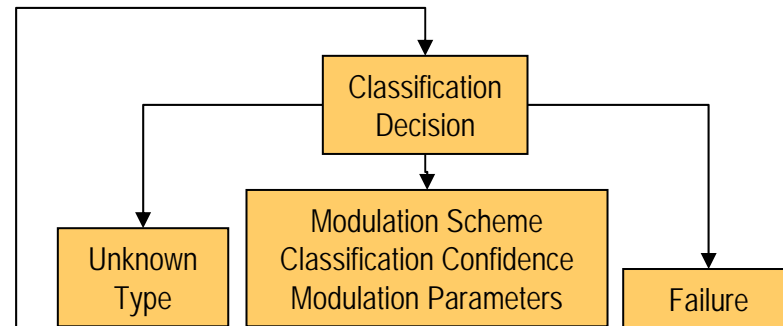
A non-cooperative communication technique which uses statistical methods to estimate the signal modulation types



Modulation Classification



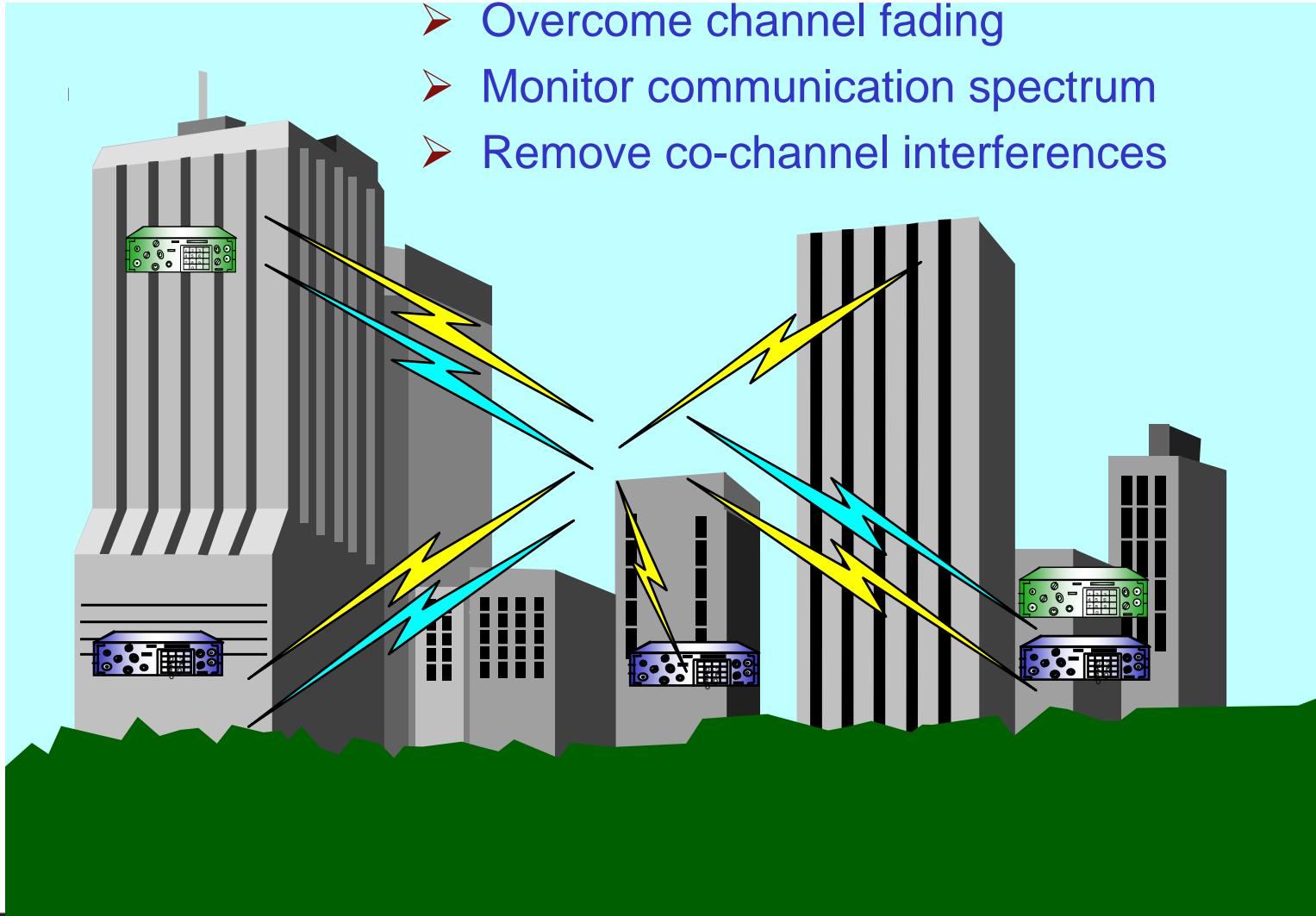
A non-cooperative communication technique which uses statistical methods to estimate the modulation type of a unknown signal





SDR Applications (1)

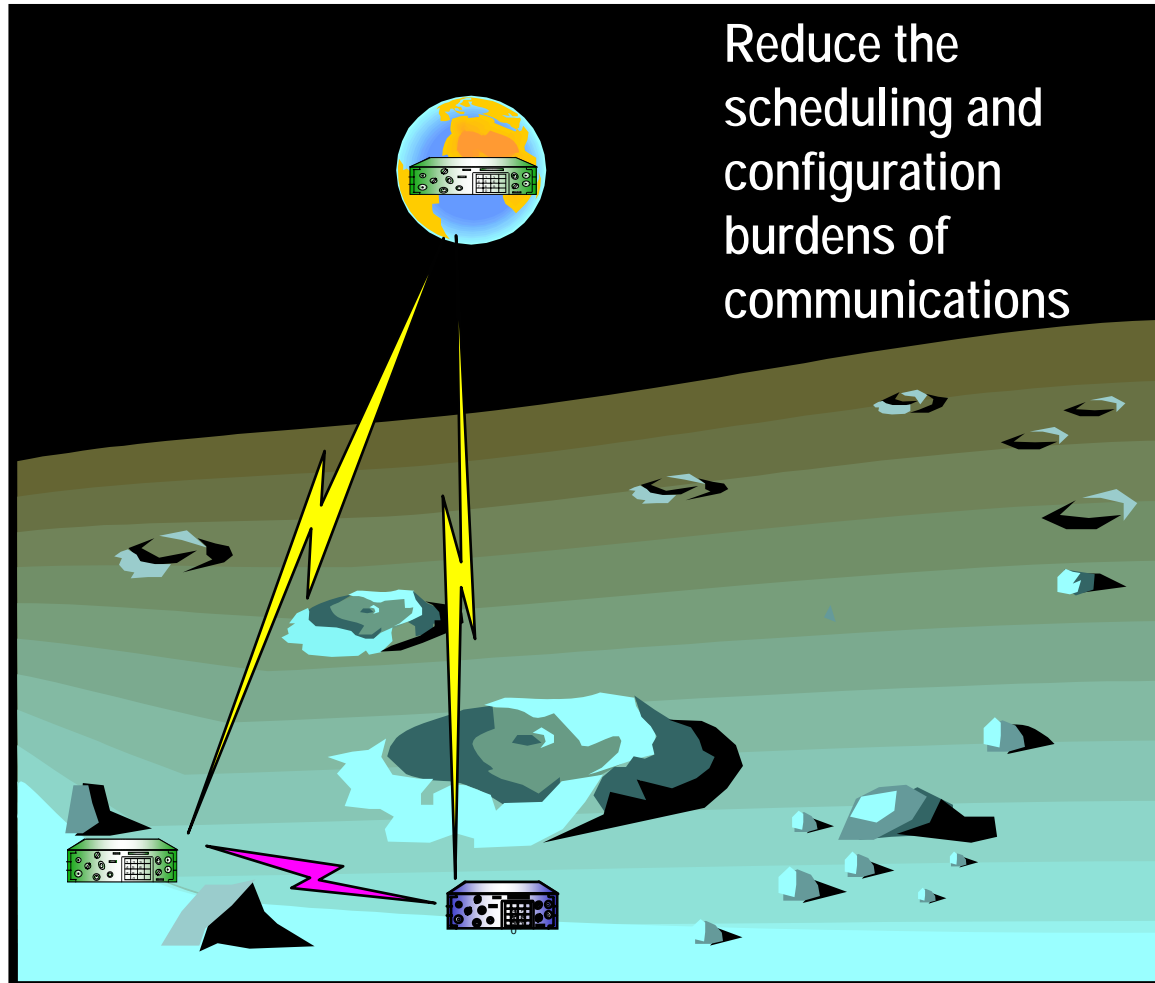
- Overcome channel fading
- Monitor communication spectrum
- Remove co-channel interferences





SDR Applications (2)

Deep Space Communication



Reduce the
scheduling and
configuration
burdens of
communications

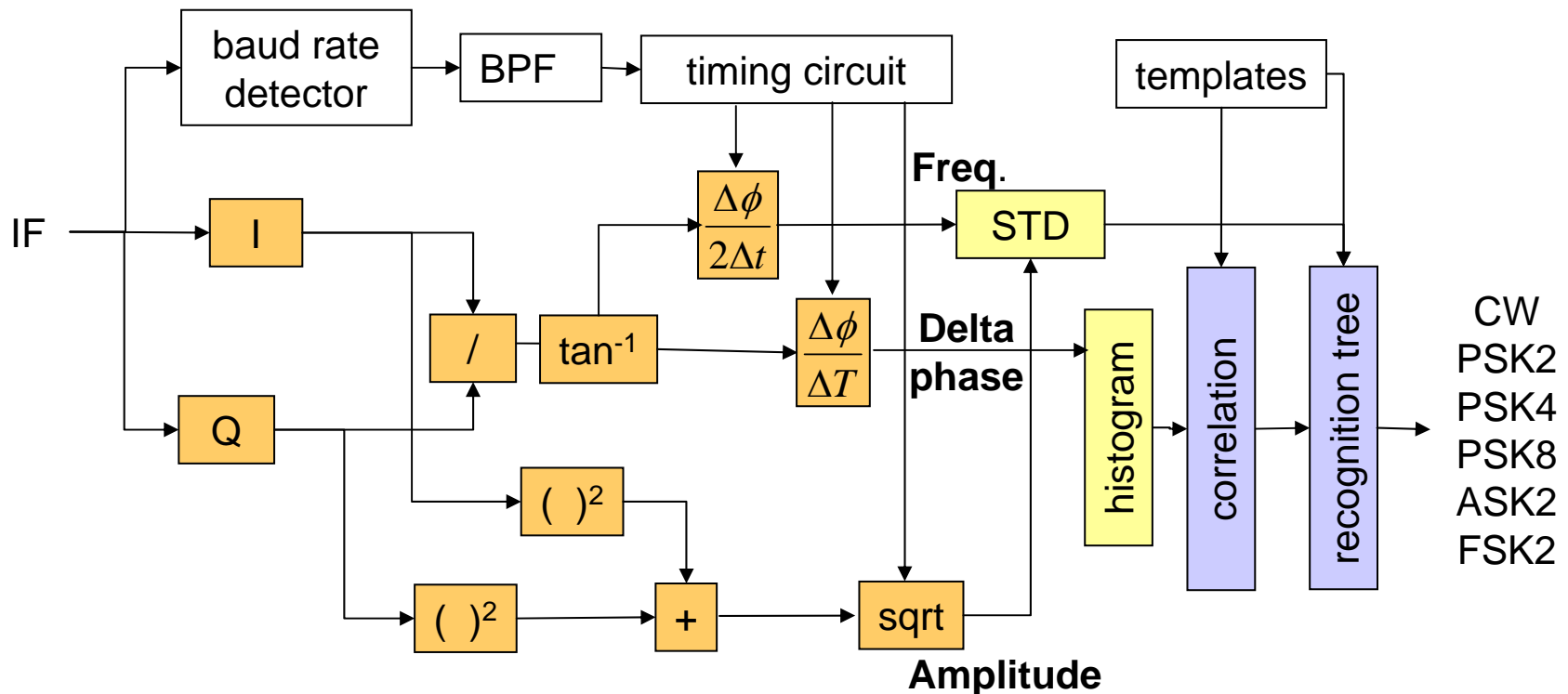


Modulation Classification Overview



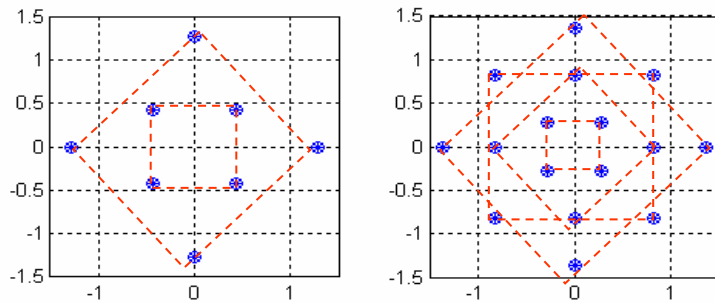
Feature Extraction: Amplitude, Differential Phase, and Frequency

- Input: IF
- Feature: Amplitude, phase, diff phase, frequency
- Statistics: histogram, STD
- Classifier: max correlation, decision tree
- Reference: Liedtke 1984

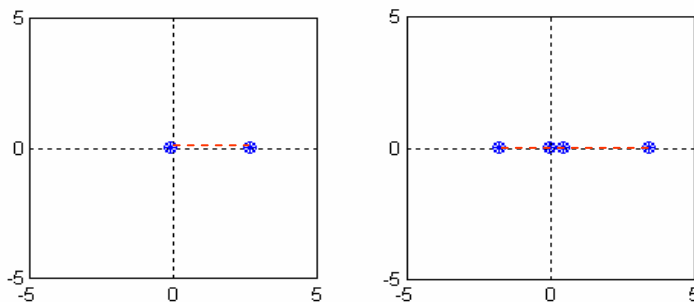




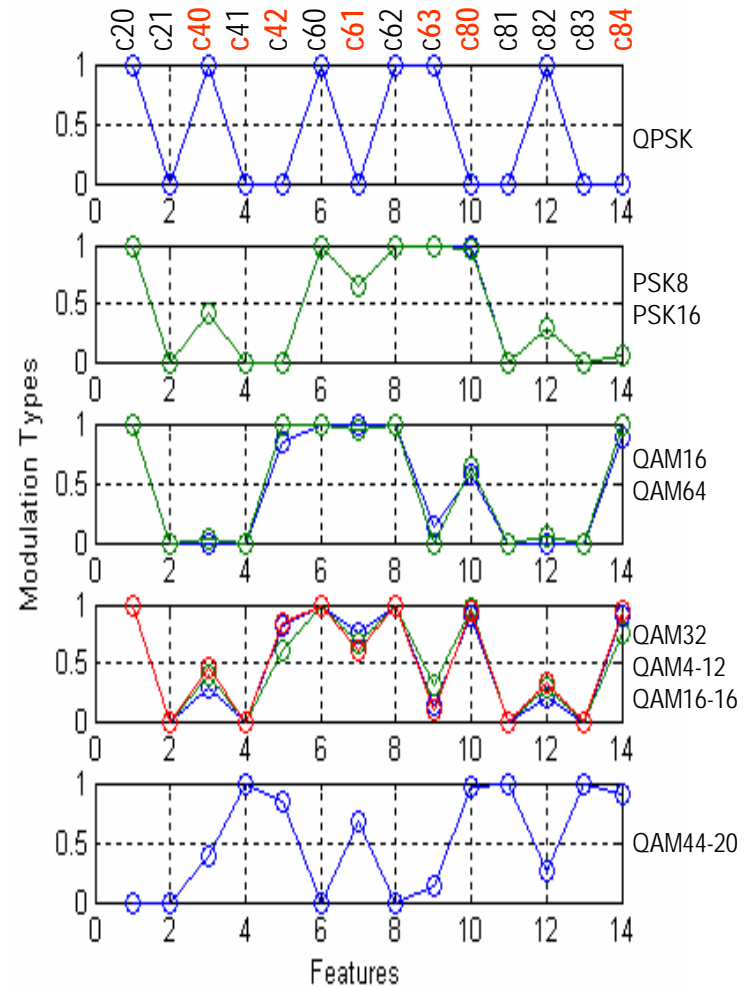
Higher-order Transform of Constellations



V29-8 and V29-16 constellations

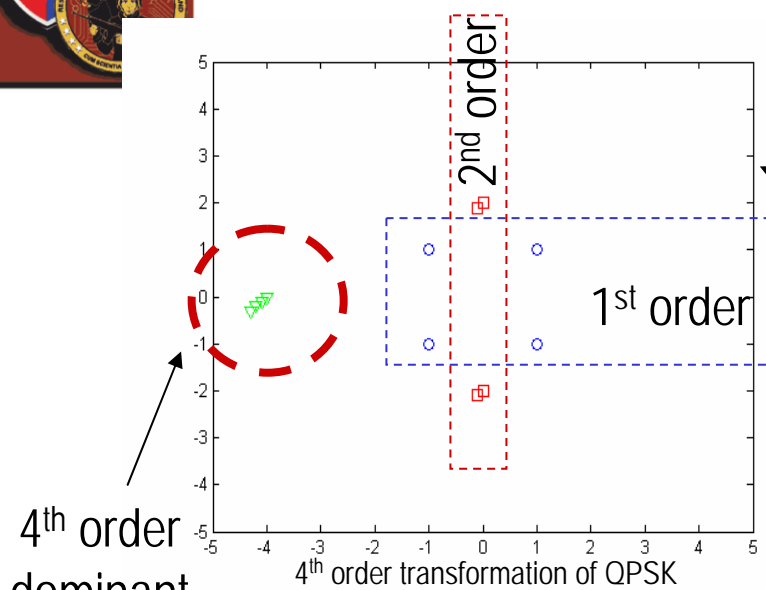


The 4th order constellations





Higher-order Statistical Features



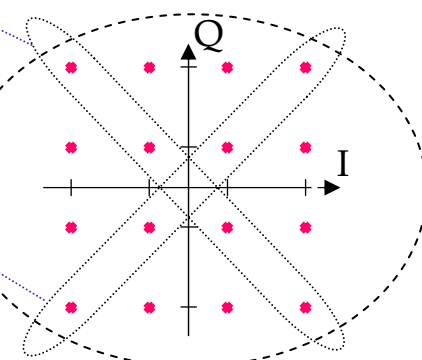
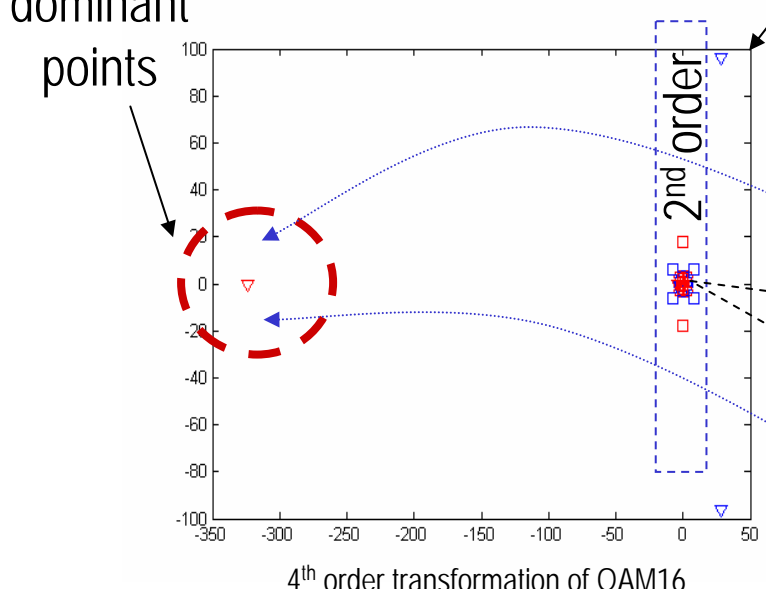
Power-law:
 $r^4(k)$

Moment:

$$m_{40} = \sum_{k=1}^K r^4(k)$$

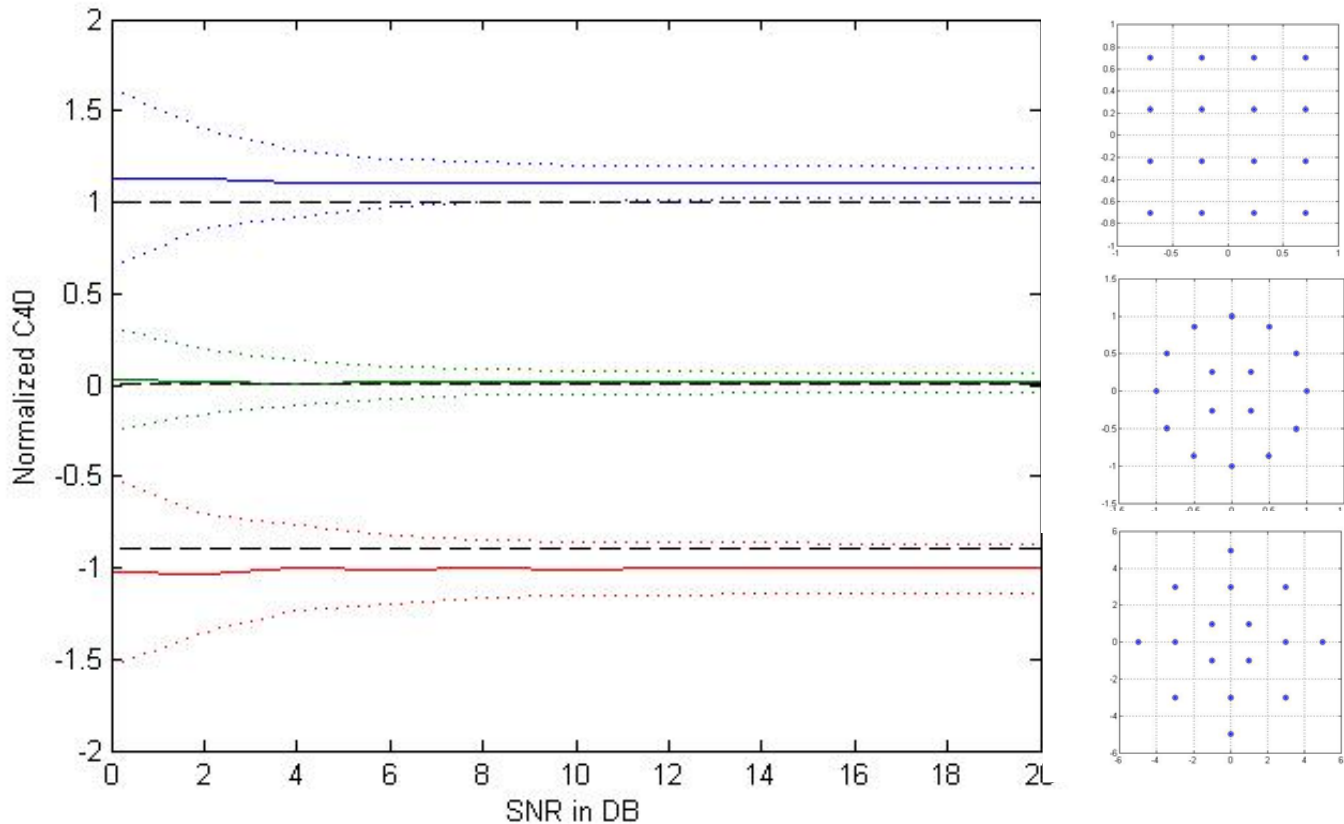
Cumulant:

$$C_{40} = m_{40} - 3m_{20}^2$$





Cumulants vs. SNRs





Cyclic Spectral Analysis

Baseband

Time varying autocorrelation

$$R_{xx^*}^*(t, t + \tau) = E\{x(t)x^*(t + \tau)\}$$

Cyclic autocorrelation

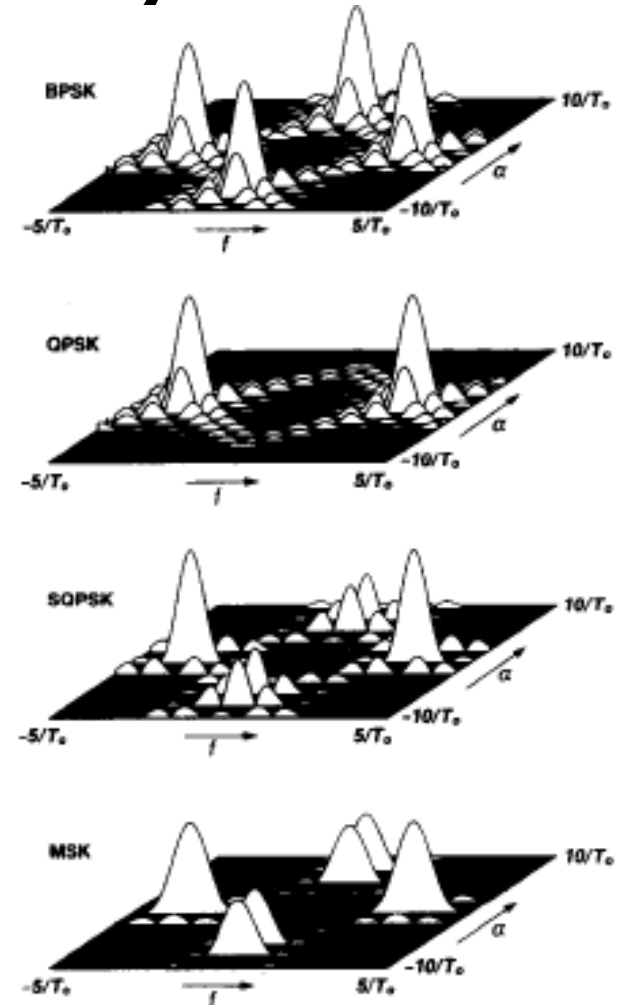
$$R_{xx^*}^a(\tau) = \lim_{T \rightarrow \infty} \frac{1}{T} \int_{-T/2}^{T/2} R_{xx^*}^*(t, t + \tau) e^{-j2\pi t\alpha} dt$$

Spectrum correlation density

$$S_{xx^*}^a(f) = \int_{-\infty}^{\infty} R_{xx^*}^a(\tau) e^{-j2\pi f\tau} d\tau$$

Cycle Freq

Decision ← Templates



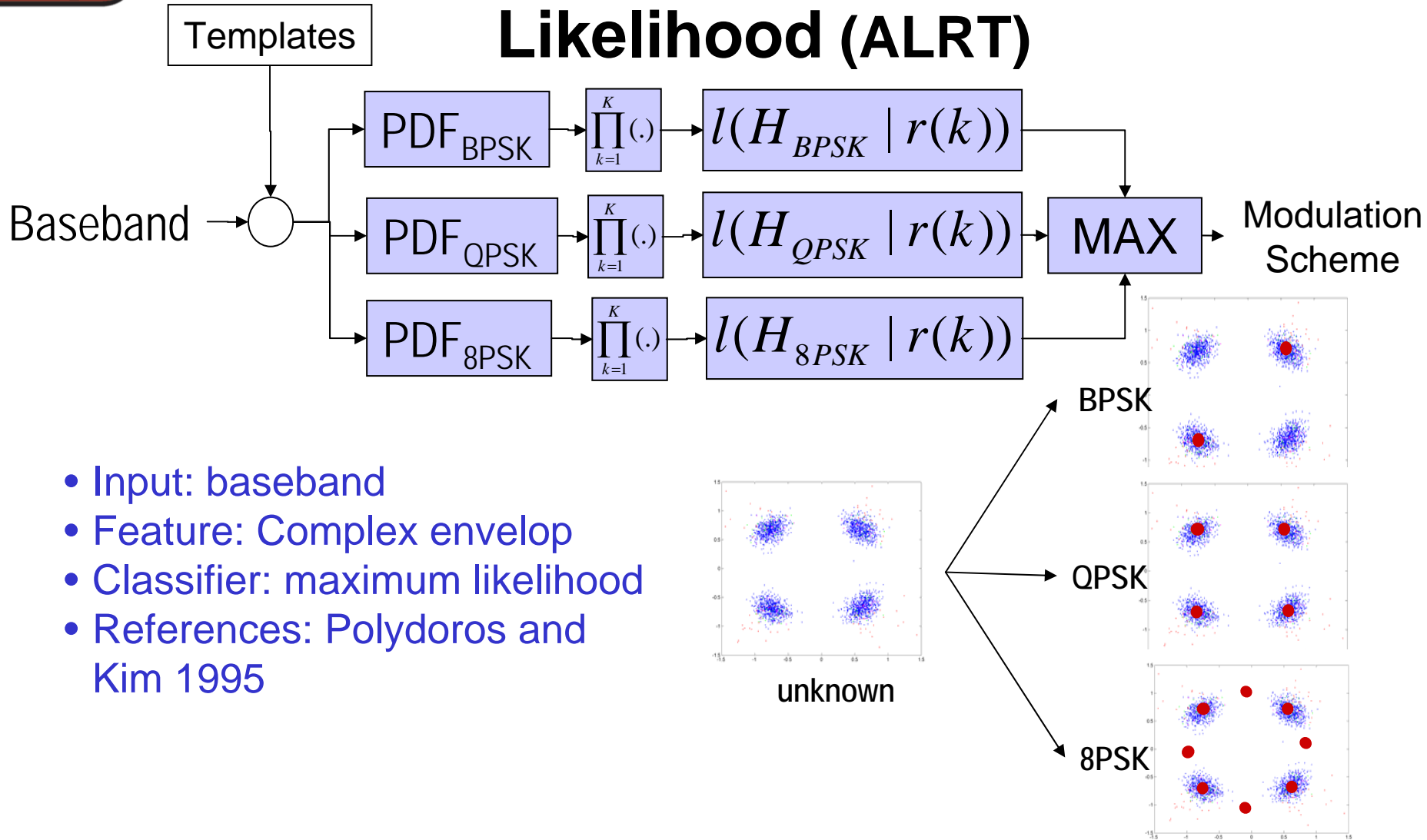
Theoretical spectrum correlation magnitude

Gardner and Spooner 1992

- Input: IF
- Features: cycle frequencies
- Reference: Menguc, 2004



Feature Classification: Maximum Likelihood (ALRT)

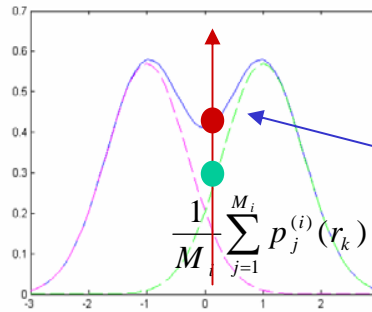
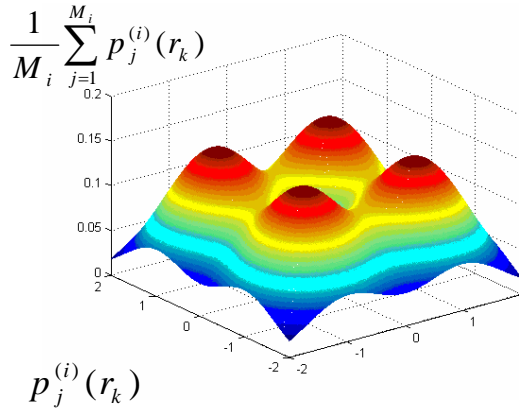


- Input: baseband
- Feature: Complex envelop
- Classifier: maximum likelihood
- References: Polydoros and Kim 1995



Feature Classification: Histogram Correlation

ALRT

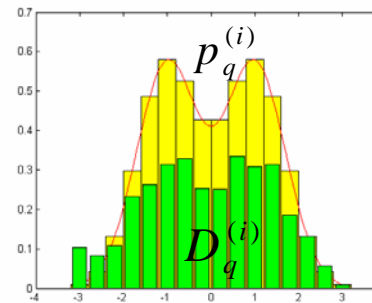
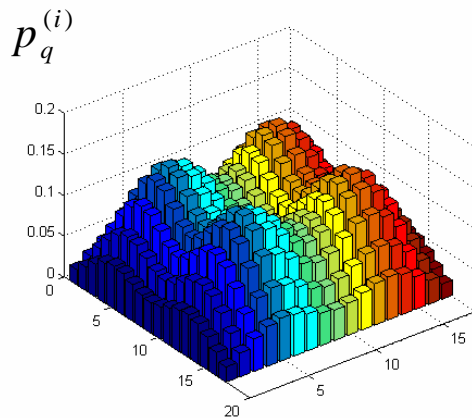


$$G(H_i | r_K) = \prod_{k=1}^K \left\{ \frac{1}{M_i} \sum_{j=1}^{M_i} p_j^{(i)}(r_k) \right\}$$

$$p_j^{(i)}(r_k) = \frac{1}{2\pi\sigma^2} \exp \left\{ -\frac{\|r_k - b^{(i)}(j)\|^2}{2\sigma^2} \right\}$$

Quantize

HIST



$$L(H_i | r_K) = \sum_{k=1}^K \log p^{(i)}(r_k) = \sum_{q=1}^Q \sum_{k \in \Omega_q} \log p^{(i)}(r_k) \leftarrow \sum_{k=1}^Q \log p_q^{(i)} D_q^{(i)}$$

- Input: baseband/IF
- Feature: frequency/diff phase
- Classifier: max correlation
- References: Liedtke 1984

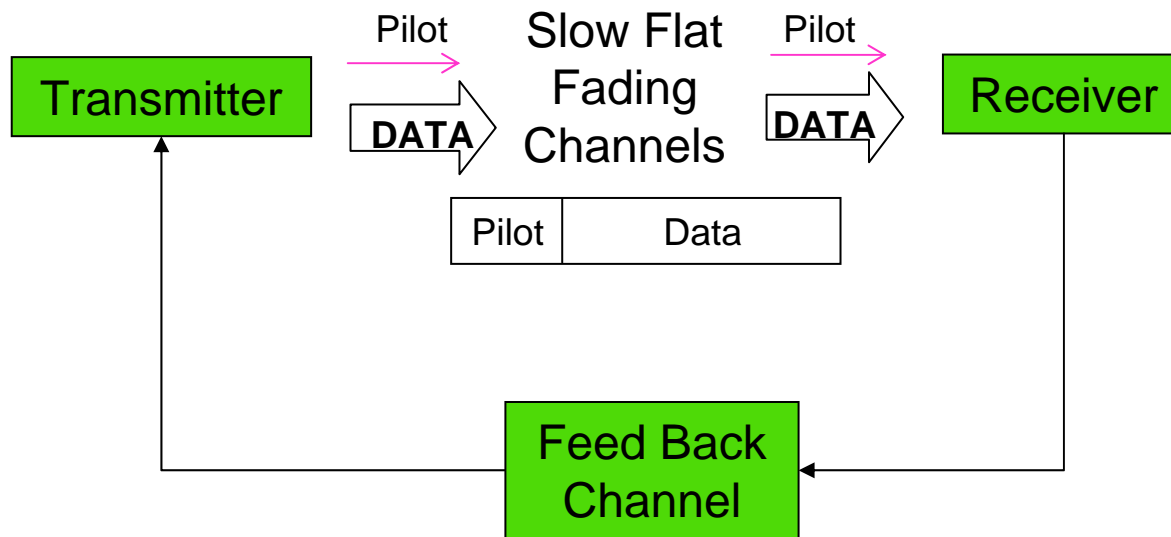


Research on Commercial Applications



Research on Adaptive Modulation Based on SDR - Cooperative

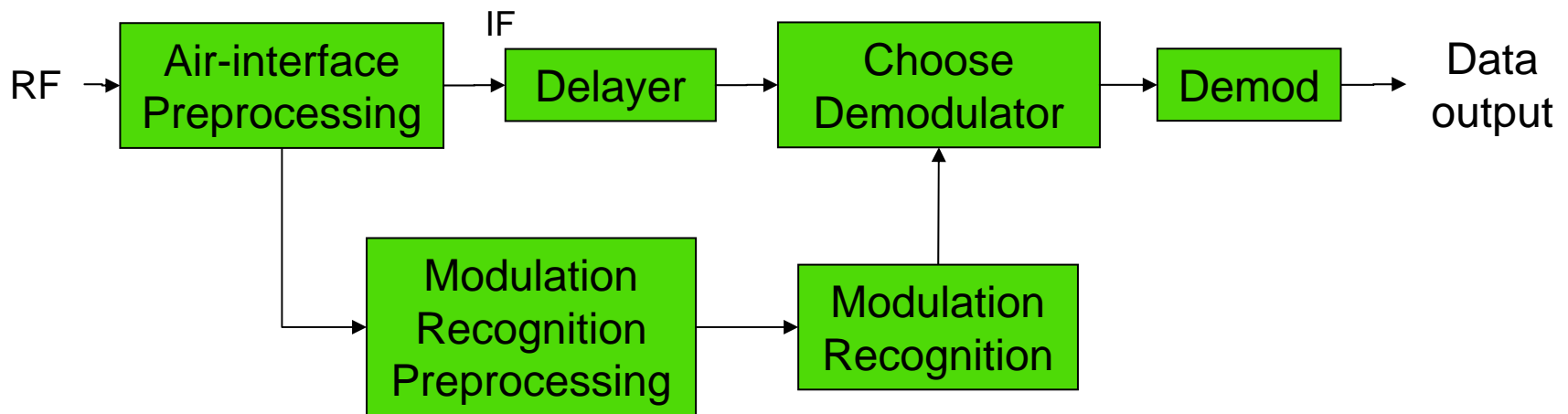
- Maintain a constant BER by varying modulation schemes
- Modulation schemes: QPSK, 16QAM, and 64QAM
- Data frame based modulation recognition
- A pilot symbol is used in forward channel
- Reference: Jain, P.; Buehrer, R.M, "Implementation of adaptive modulation on the Sunrise software radio," The proceedings of the 45th Midwest Symposium on Circuits and Systems, Volume: 3 , 4-7 Aug 2002. Pages:III-405 - III-408





Why Applying Non-cooperative Demodulation

- Environment limitation and restriction
- Elimination of the signal overhead information
- Attractive for packet data services





Deference Between Military and Commercial Applications

	SIGINT	SDR
Real time	classification	demodulation
SNR	low	high
Candidates	unlimited	limited
QoS	friend / foe	packet loss
Pulse shape	unknown	known
Bandwidth	unknown	known
Baud rate	unknown	known
Blindness	more	less



Research of Nolan et al. Reduce Form Constellation

Assume:

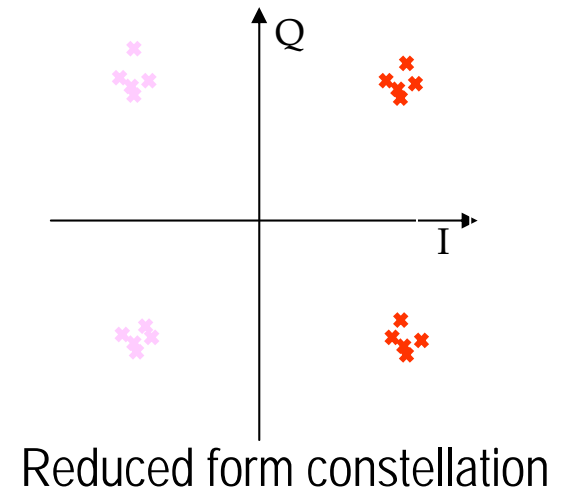
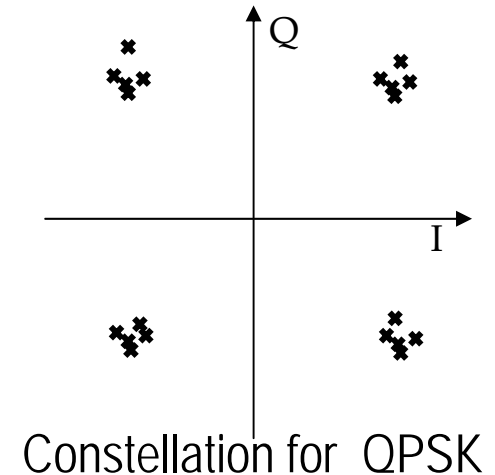
- Equally likely
- Symmetrical QAM/PSK

Purpose:

- Reduce the processing time

Issues:

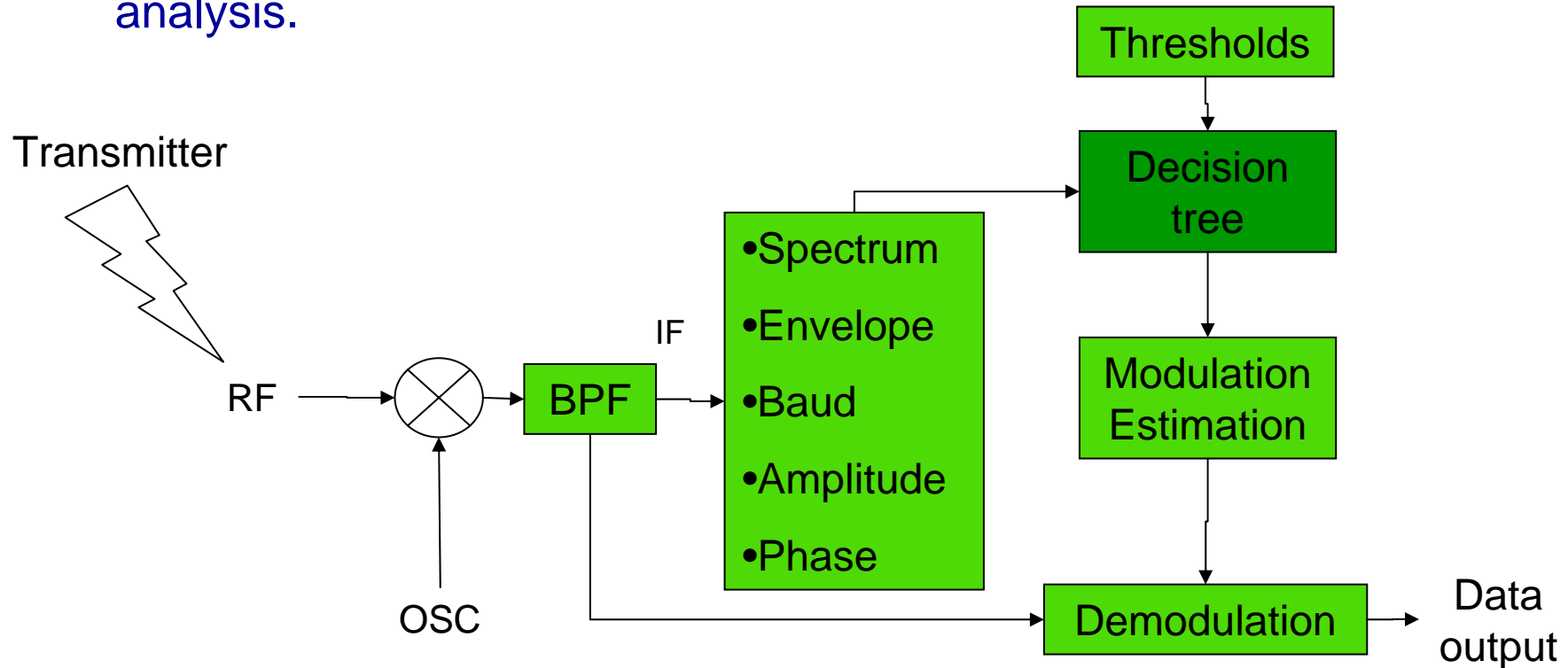
- Low utilization of available information
- May need longer data length for randomness





Adaptive Receiver – Ishii et al.

- Automatically recognize BPSK, QPSK, 8PSK, pi/4QPSK, 16QAM, FSK, MSK, GMSK, AM, FM, CW, and SSB using decision tree for spectrum, variance, and baud detection analysis.



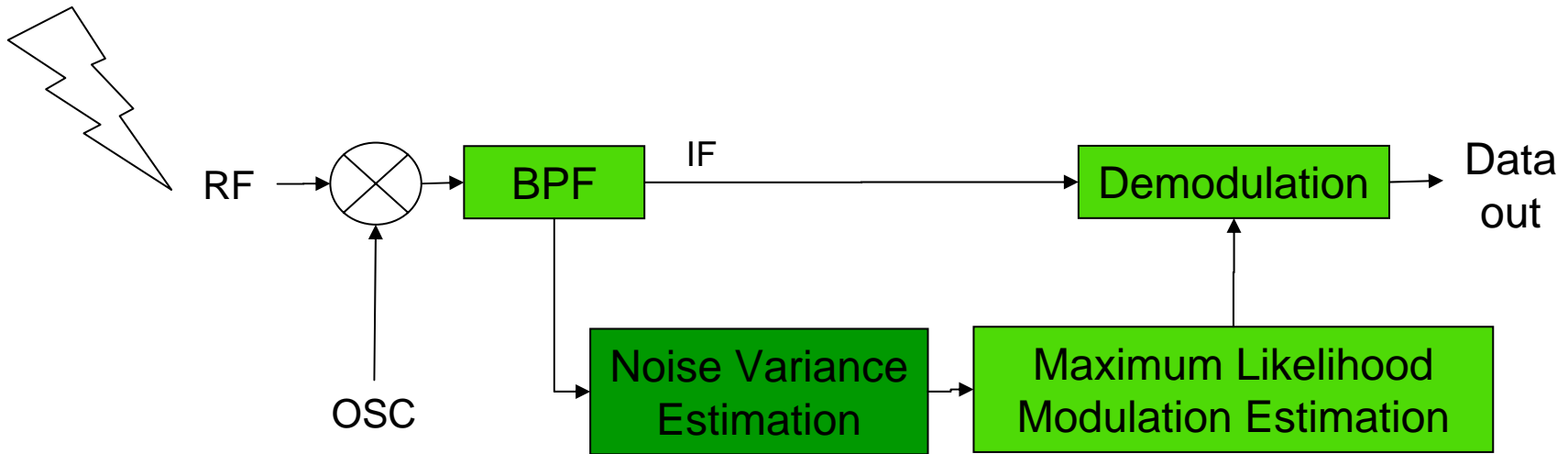


Blind Modulation Estimation

Umebayshi et al.

- Automatically recognize BPSK, QPSK, 8PSK, and 16QAM using amplitude and differential phase variances. Channel gain estimation is discussed (2000).
- Automatically recognize BPSK, QPSK, and 8PSK using differential phase and maximum likelihood test.

Transmitter



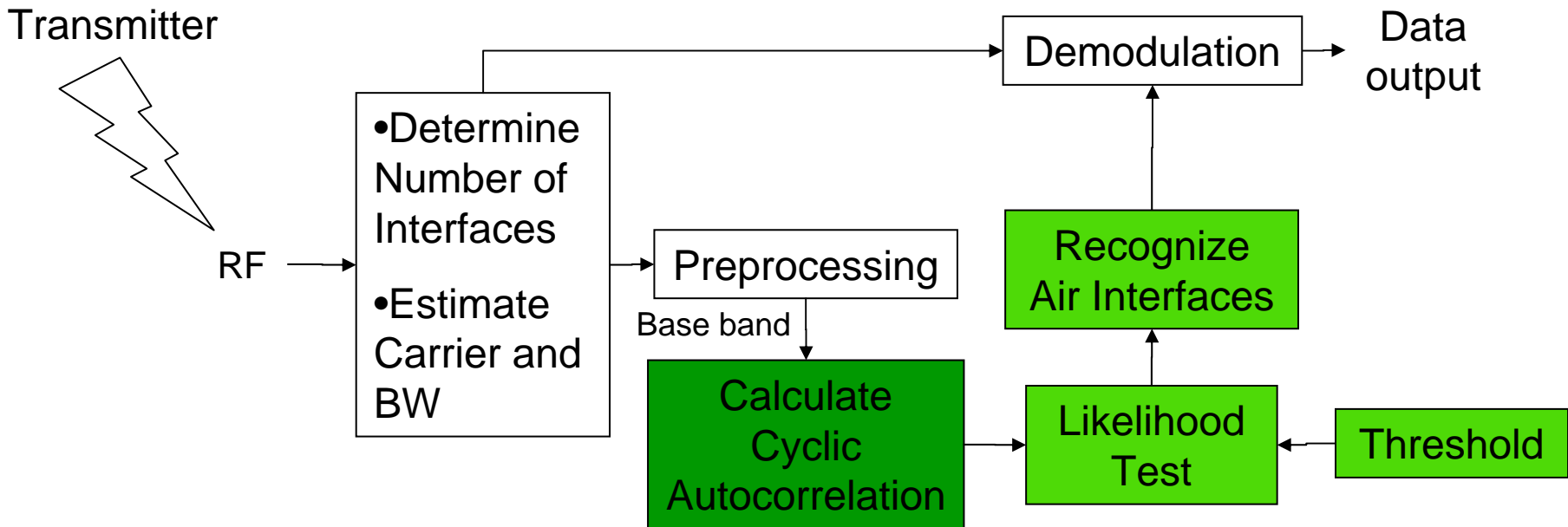


Research of Menguc and Jondral (1)

Air Interface Identification for SDR

Identify (Verify?)

- TDMA-GMSK
- OFDM-PSK/QAM
- CDMA-QPSK

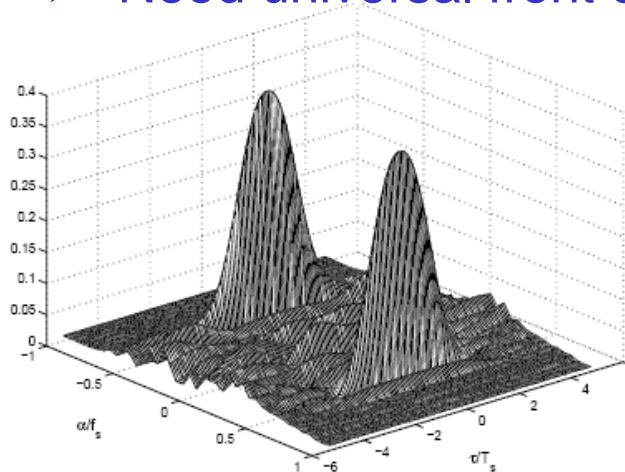




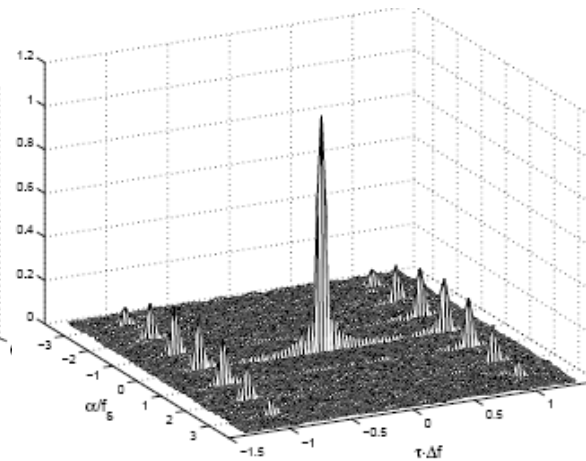
Research of Menguc and Jondral (2) Magnitude Plot of the Cyclic Autocorrelation Estimations

Issues

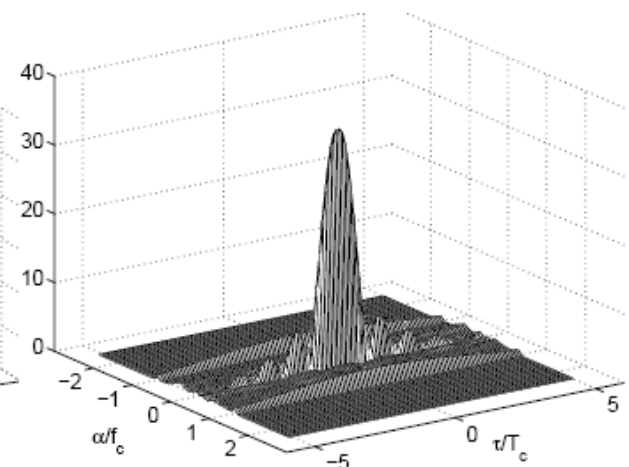
- Processing speed
- Need universal front end



GMSK



OFDM



CDMA

* O. Menguc, "Air interface identification for software radio systems," Ph.D. Dissertation, University of Fridericana Karlsruhe, Nov. 30, 2004.

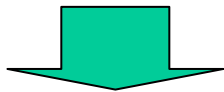


Research of Simon and Divsalar (1) Data Format classification for SDR

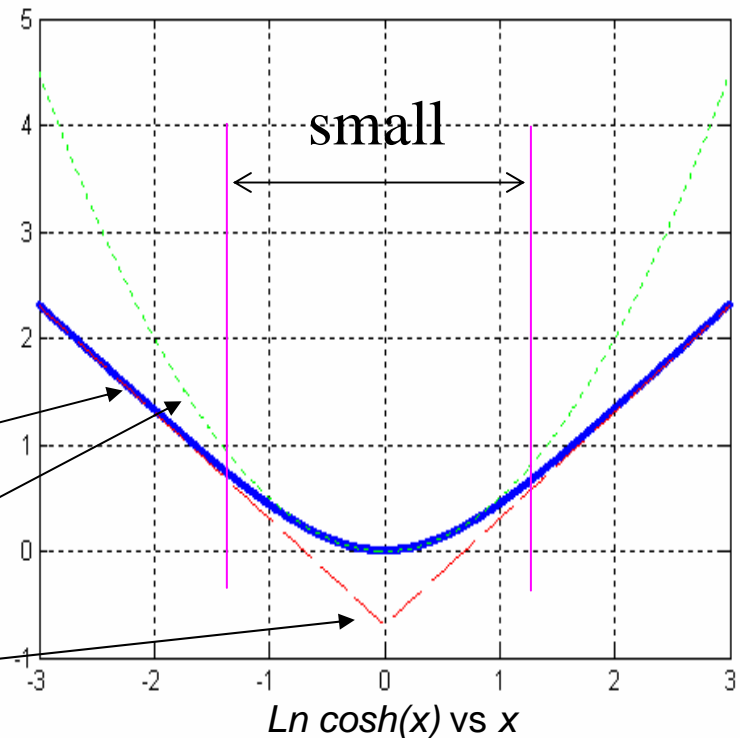
- Discriminate NRZ and Manchester code
- Reduce complexity
- Extend to non-coherent case

Use two curves approximate $\ln \cosh(x)$ in order to simplify the ML computation

$$\sum_{n=0}^{K_b-1} \ln \cosh\left(\frac{2\sqrt{2P}}{N_0} r_{k,NRZ}\right) < \sum_{n=0}^{K_b-1} \ln \cosh\left(\frac{2\sqrt{2P}}{N_0} r_{k,Manchester}\right)$$



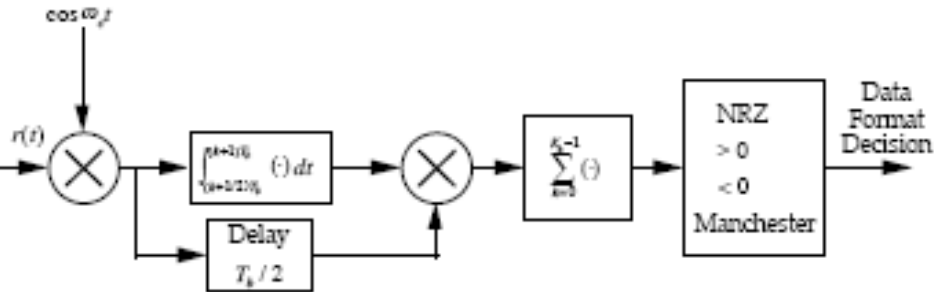
$$\ln \cosh(x) \cong \begin{cases} x^2 / 2; & x \text{ small} \\ |x| - \ln 2; & x \text{ large} \end{cases}$$



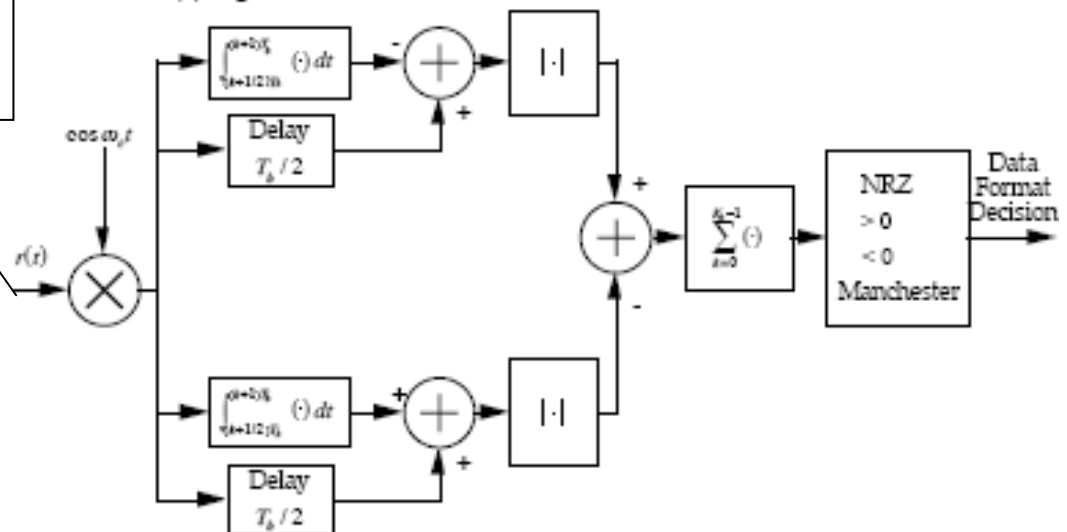


Research of Simon and Divsalar (2) Reduced Complexity ML Implementation

(a) Low SNR



(b) High SNR



Baseband Data

SNR Estimation



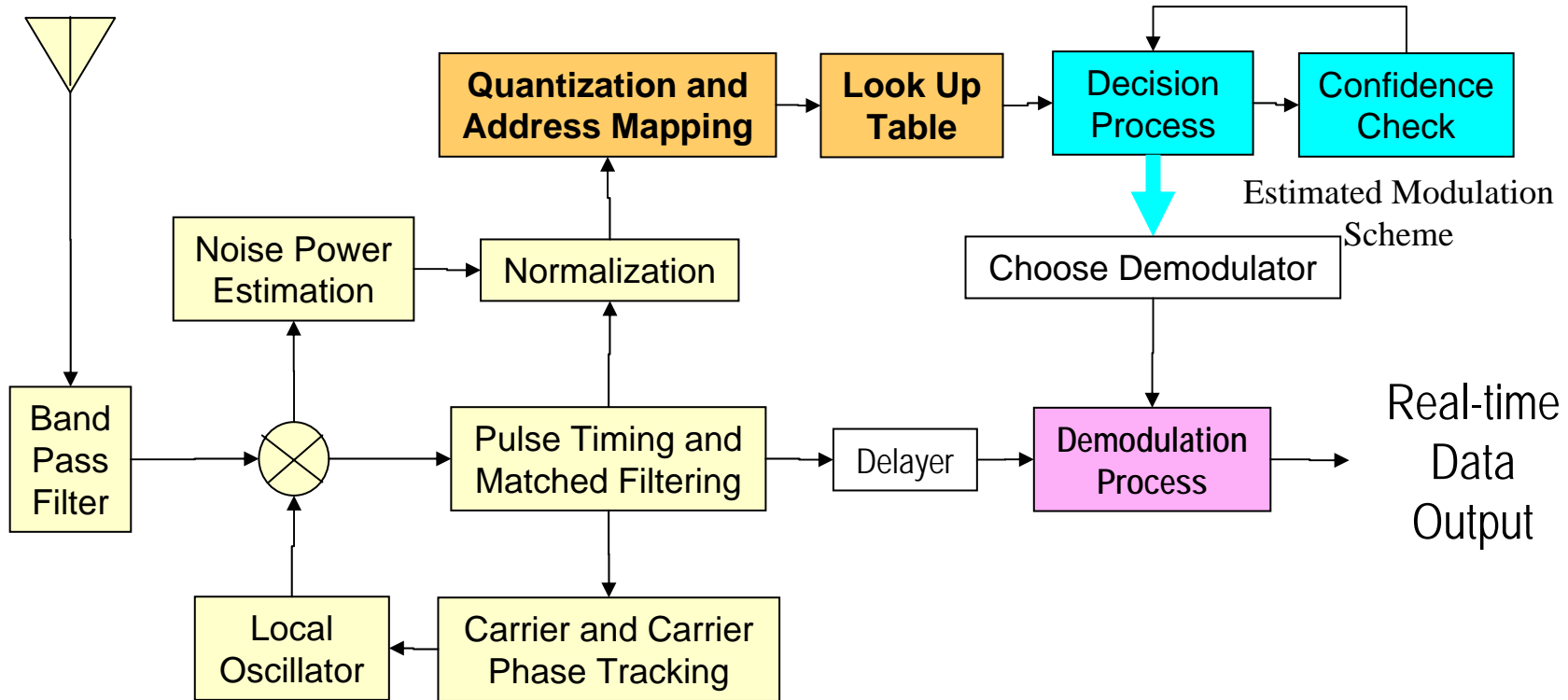
Other Research Results on Modulation Classification Based on SDR

- Gu et al. "Channelized receiver platform of SDR based on FPGAs, Proceedings of The 5th IEEE International conference on ASIC, Vol.2, Oct. 2003, pp.840-843.
- Yang, "An enhanced SOFM method for automatic recognition and identification of digital modulations," Proceedings of the 2nd IEEE International Workshop on Electronic Design, Test and Applications (DELTA'04), Jan. 2004, pp.174-179.
- Ko et al. "Modulation type classification Method using wavelet transform for adaptive demodulator," Proceedings of 2004 International Symposium on Intelligent Signal processing and Communication System, Vol.46, Oct. 1995, pp.211-222.
- Hooftand Darwish, "A reconfigurable software digital radio architecture for electronic signal interception, identification, communication and jamming," *COTS Journal*, April 2002, pp.31-35.



US Army Research, Development and Engineering Command

RF signal





Summary

- Adaptive modulation is not only an important information warfare practice but also an effective tool to maximize the data capacity and minimize the transmission error in SDR applications.
- Automated modulation classification is a solution in handling the non-cooperative communication problem for SDR.
- Blind estimation of modulation parameters such as center frequency offset, carrier phase, pulse shape, symbol rate, and bandwidth is critical to the robustness of modulation classification.
- A good modulation classifier should be able to identify modulation scheme fast and robust.



Future Work

- Faster estimator
- Shorter data length
- Lower SNR
- Better channel estimation
- Better QoS