

CSI Internal Seminar

# Correlation Coefficients among Some Statistics Used for Signal Detection



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3:30PM – 4:30PM

EEB248

## REFERENCES

This talk is based on the following two papers:

- [1] J. Bae et al., "Explicit correlation coefficients among random variables, ranks, and magnitude ranks," *IEEE Trans. Inf. Theory*, Vol. 52, No. 5, pp. 2233-2240, May 2006.
- [2] J. Bae et al., "An asymptotic relative performance measure for signal detectors based on the correlation information of statistics," *IEICE Trans. Commun.*, Vol. E88-B, No. 5, pp. 4643-4646, Dec. 2005.

**CONTENTS OF THIS TALK**  
Motivation, Results, and Approach

Why?

What?

How?

**Motivation**

**Results**

**Approach**

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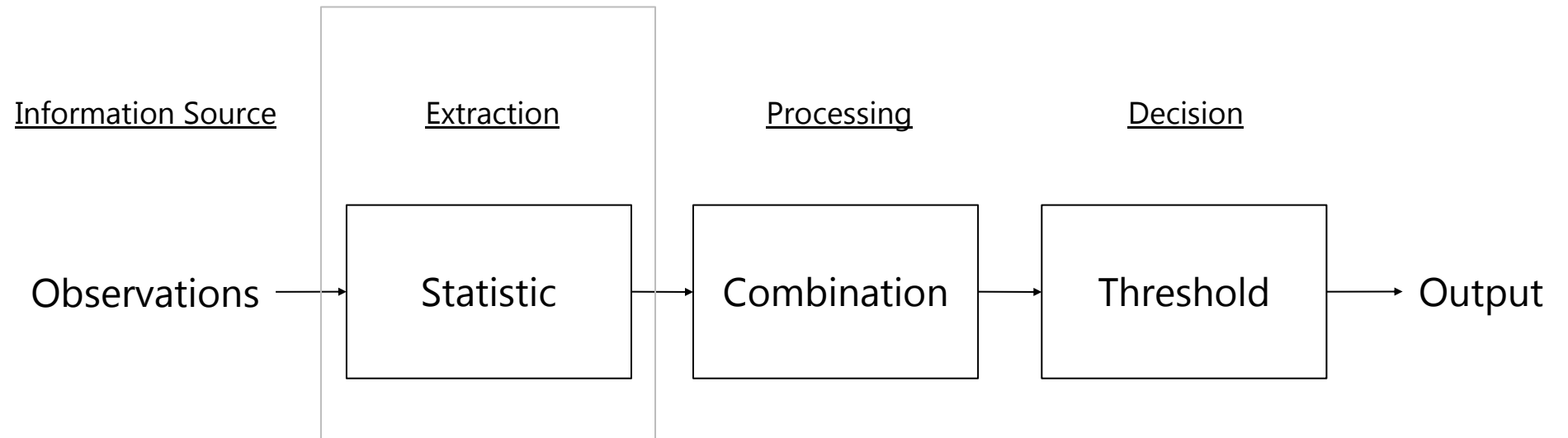
**30%**

**10%**

**DETECTOR STRUCTURE**

Statistic , combination, and threshold

Information is extracted from observations and conveyed to the output in a detector:  
Detection is about information.

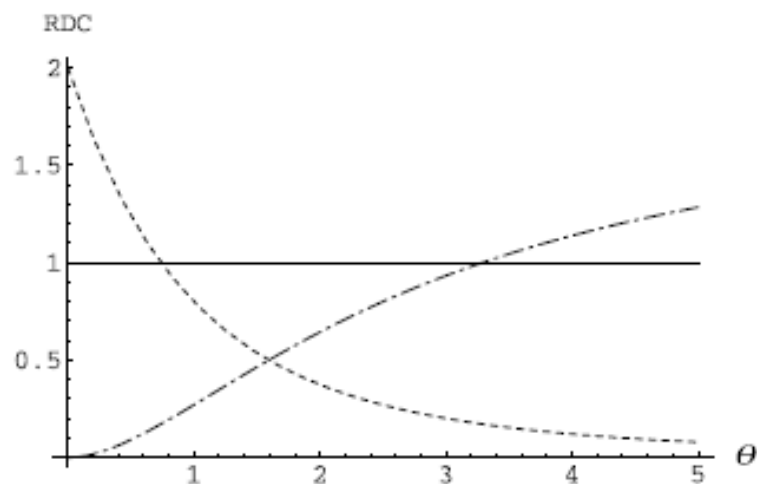


**RAW OBSERVATIONS vs. STATISTICS**

Negative information coming from noise

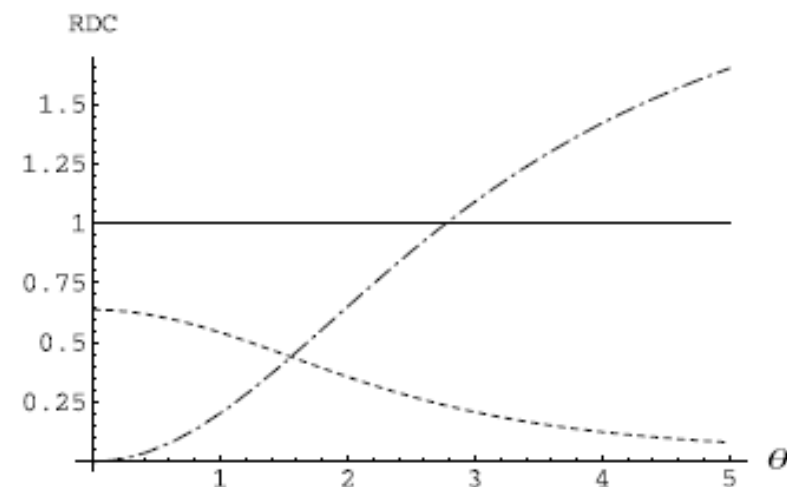
Using only partial information via statistics is sometimes beneficial for signal detection.

Laplace noise



**Fig. 2** Asymptotic performance comparisons in Laplace noise. (dashed:  $RDC_{S,L}(\theta)$ , dot-dashed:  $RDC_{M,L}(\theta)$ )

Gaussian noise

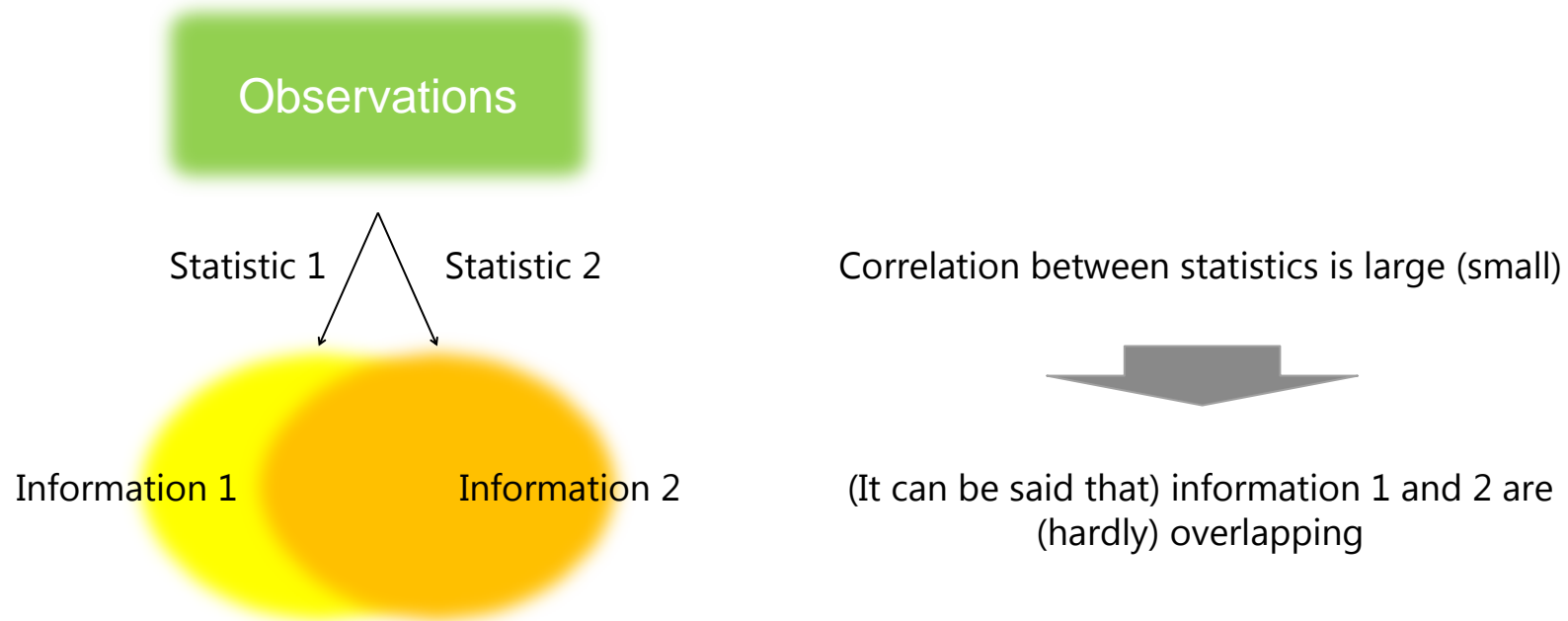


**Fig. 3** Asymptotic performance comparisons in Gaussian noise. (dashed:  $RDC_{S,L}(\theta)$ , dot-dashed:  $RDC_{M,L}(\theta)$ )

## CORRELATION AND INFORMATION

Physical meaning of the correlation of statistics

Our Assumption: Information extracted via two statistic is similar (different) if the correlation between the statistics are large (small) enough.



### A DETECTOR USING A NEW STATISTIC

Need for substitute

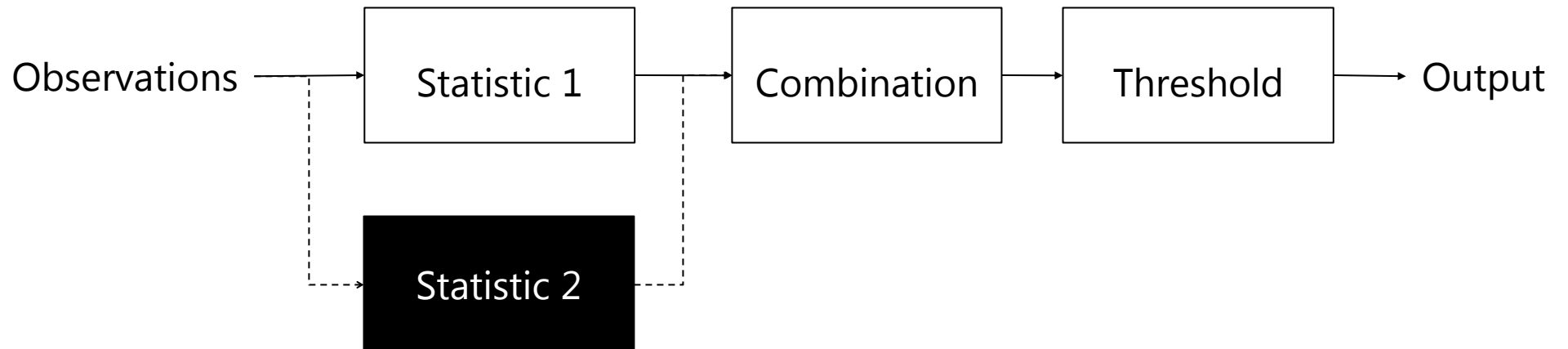
We *might* keep the detector performance almost the same if we employ another statistic with large correlation with the original statistic: Let it provide similar information.



### A DETECTOR USING MORE THAN TWO STATISTICS

Need for more information

We *might* enhance the detector performance if we employ additional statistic with little correlation with the existing statistic: Let it provide additional new information.





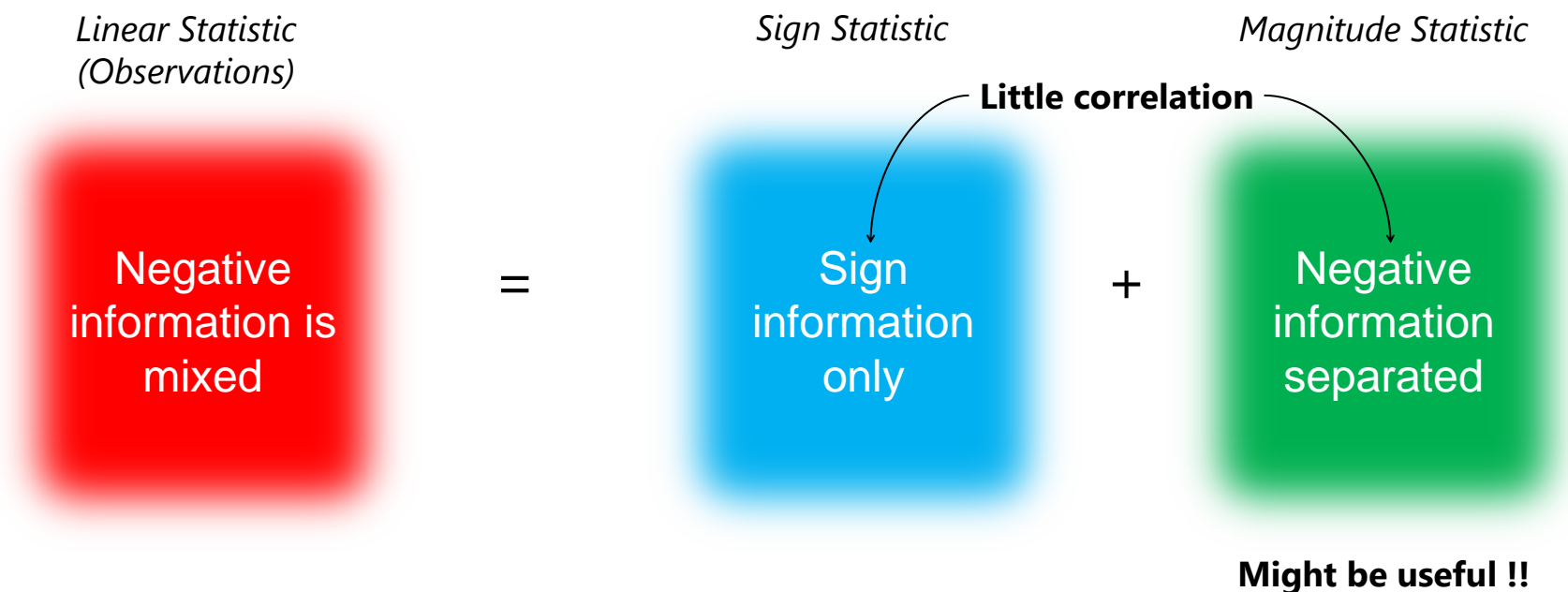
What if the new statistic has a negative information ?

**NEGATIVE INFORMATION**

No useless information

Negative information can be beneficial if it is separated and processed individually.

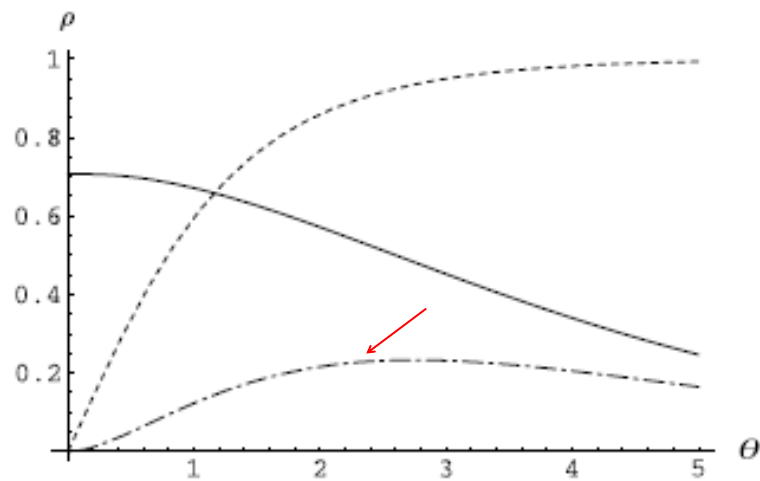
Laplace Noise Case



Sign and magnitude has little correlation.

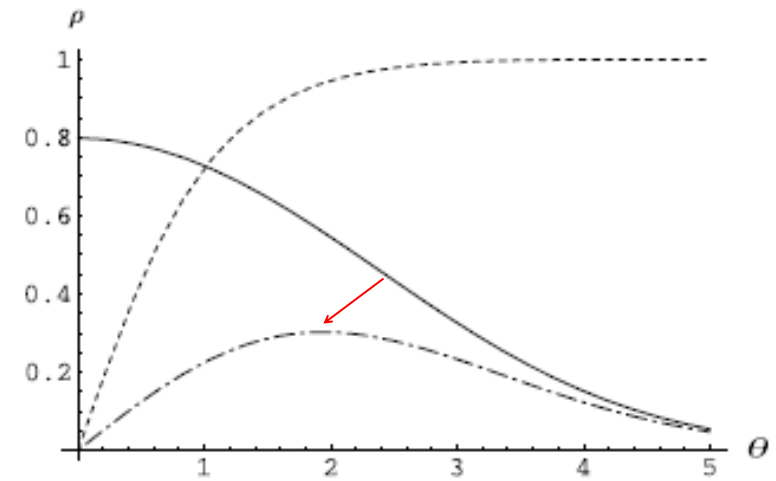
## CORRELATION OF SIGN AND MAGNITUDE STATISTICS

Laplace noise



**Fig. 4** Correlation coefficients for Laplace noise. (solid:  $\rho_{Z_i X_i}(\theta)$ , dashed:  $\rho_{|X_i| X_i}(\theta)$ , dot-dashed:  $\rho_{Z_i |X_i|}(\theta)$ )

Gaussian noise



**Fig. 5** Correlation coefficients for Gaussian noise. (solid:  $\rho_{Z_i X_i}(\theta)$ , dashed:  $\rho_{|X_i| X_i}(\theta)$ , dot-dashed:  $\rho_{Z_i |X_i|}(\theta)$ )

## (INTERIM) SUMMARY OF MOTIVATIONS

¶ Performance of a detector, a linear/nonlinear combination of statistics, is affected by both the way of combination and the statistics used for detection.

¶ Little attention has been paid to possible detection methods using two different statistics simultaneously and those using another statistic instead of the statistic employed originally.

¶ Among the first steps is to address the bivariate correlation of statistics to answer questions such as:

“What would be the detector performance if we replace a statistic with another one, fixing the way of combination?”

“How can we predict the detector performance with a new statistic?”

“Which pair of statistics should be taken to get a better performance if more than two statistics can be used together in a detector?”

¶ **For low power communications, efficient detection is necessary. (Why?)**

## **SOME THOUGHTS OF MINE ABOUT DETECTION**

Detection is not popular

- ¶ Is the linear detector enough for every applications ? Has anyone seen the rank (or another advanced detector in commercial communication systems?
- ¶ I could not find any detector block in the block diagrams of modern commercial communication systems: There is no advanced detector used but the linear detector (or matched filter).
- ¶ Detection is just a theory or mathematics, not engineering any more.
- ¶ Good for dissertation theme, because it is easy to publish: Most engineers are not interested in this topic any more; no competition.
- ¶ I had to ask to myself when I was a graduate student. "Can I get a detection job in the future?"
- ¶ Am I wasting your precious time ?
- ¶ Why am I stick to detection ? (I am proud of being a detectionist.)

# Chapter 1

## Introduction

### 1.1 An Overview

Although *signal detection* has very much practical aspects and been of great interest so far, in fact, it is very classical, theoretical, and of a long history. It is based on the hypothesis testing of statistics, therefore not easy to understand and develop. Most of communication engineers in earlier ages were involved in researches related to the detection. The fact that it has been survived in this highly-speeded developing era proves its importance in communication theory. Whenever a new disturbance model is introduced to meet highly precise and complicated circumstance description, a new detection scheme becomes necessary. As the disturbance model gets descriptive, it becomes complex necessarily. It is natural that a novel detection scheme is necessary for a much more intricate disturbance.

Earlier detectionists were interested in the optimum detection based on maximum likelihood (ML) ratio [1]. It has the maximum power function over all the signal strength. Because it is not available all the way, however, the application area cannot help being so limited. Actually, it is very difficult to obtain the optimum scheme for the given disturbance model in most cases, since mathematical manipulations are intangible.

Detection doesn't matter at high SNR.

Motivation

## DETECTION vs. POWER

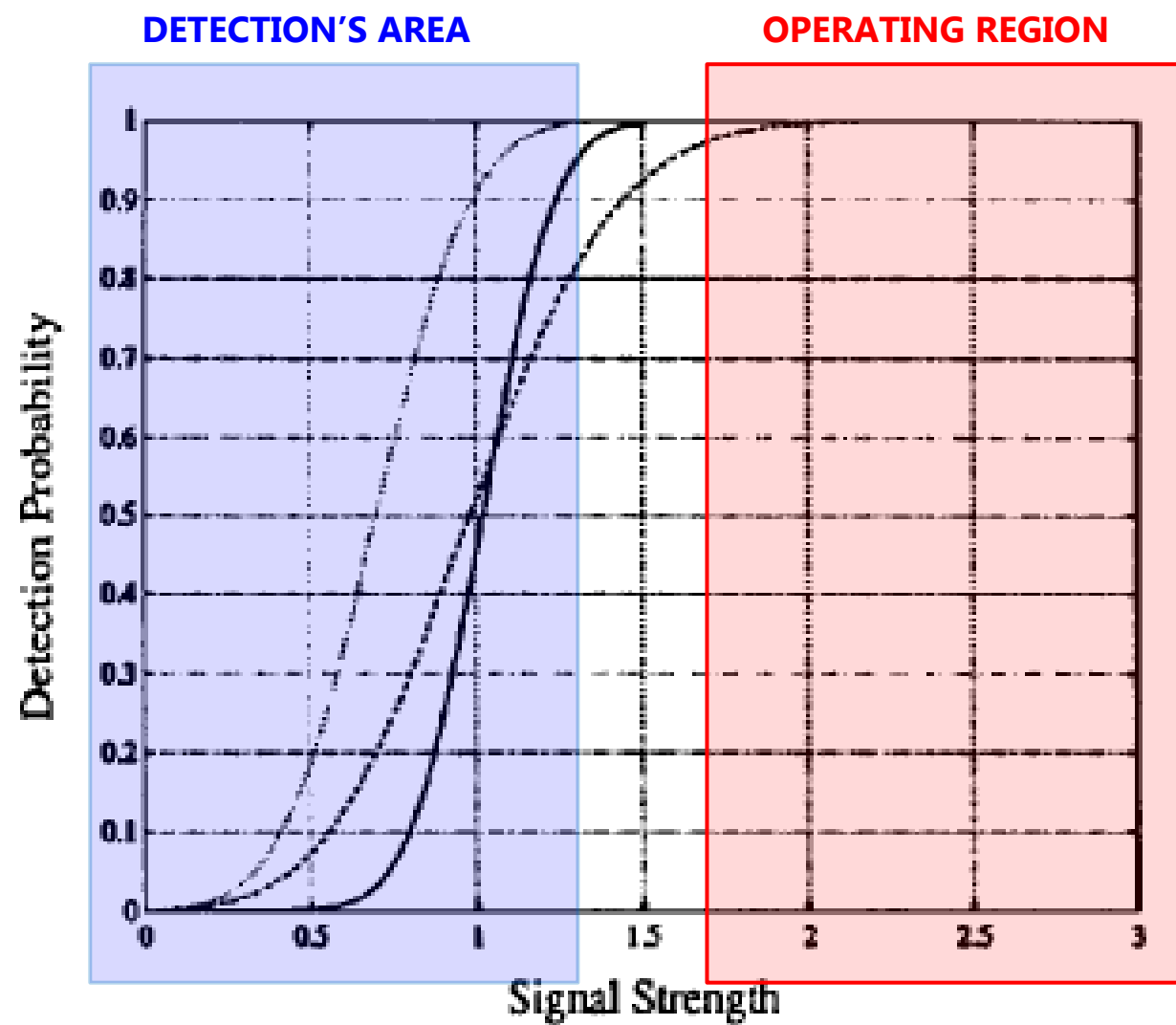


Fig. 1. Detection probability of known signal under Gaussian noise.

## APPLICATION AREAS OF DETECTION

Low (unfair) power situation

Raising (or controlling) power was easier and economic.

**Decades ago**

Radar / Sonar

The power level of reflected signal is low

**Years ago**

Multuser detection

Competing with the power control technique

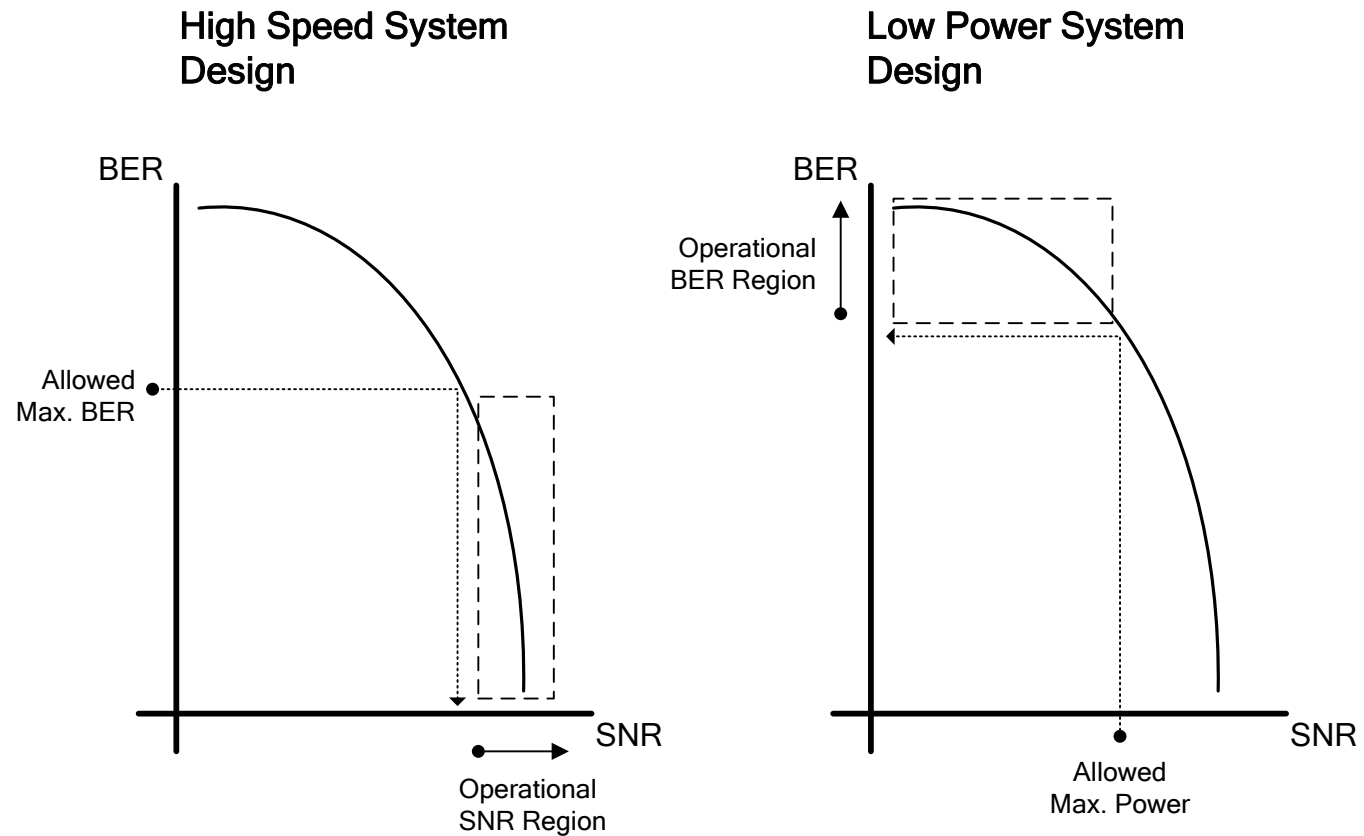
**Near future**

Low power communication

Limitation and difficulty in raising power

## HIGH SPEED vs. LOW POWER SYSTEMS

The design approaches may be different

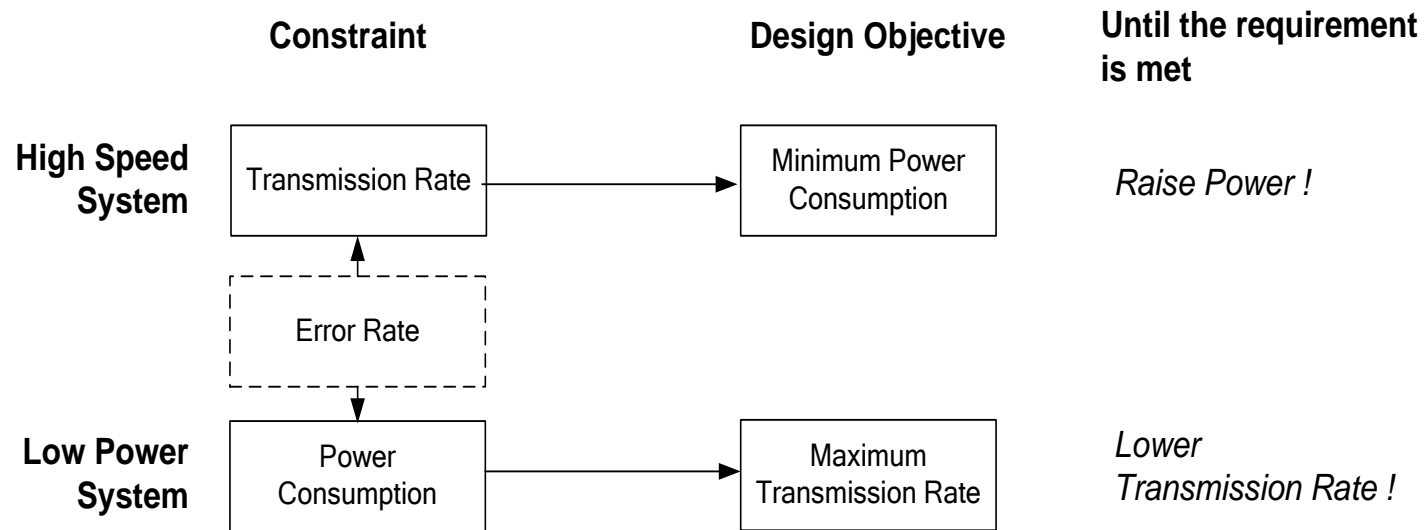




What if we can't raise power any more ?

**EXAMPLE: DESIGN FLOW**

Which is the main constraint, power or rate ?



## TWO PARADIGMS

Power saving vs. Simple detector

### Save the power

Achieved low power consumption even with a complicated detector



Maximum utilization of information is required



Among the first steps, the correlation properties of statistics might be investigated.

### Use more power

Use more power, instead keep the detector simple



Might have limitation in low power communication systems

### FIVE STATISTICS COMMONLY USED FOR SIGNAL DETECTION

There are five statistics commonly used for signal detection: Linear, sign, magnitude, rank, and magnitude rank statistics

	<u>Linear</u>	<u>Sign</u>	<u>Magnitude</u>	<u>Rank</u>	<u>Magnitude Rank</u>
<u>Notation</u>	$\bar{X}$	$\bar{Z}$	$ \bar{X} $	$\bar{R}$	$\bar{Q}$
<u>N - tuple form</u>	$(X_1, X_2, X_3)$	$(Z_1, Z_2, Z_3)$	$( X_1 ,  X_2 ,  X_3 )$	$(R_1, R_2, R_3)$	$(Q_1, Q_2, Q_3)$
<u>Example</u>	$(-1, -4, 5)$	$(-1, -1, 1)$	$(1, 4, 5)$	$(2, 1, 3)$	$(1, 2, 3)$
<u>Information Extracted</u>	All	Information 1	Information 2	Information 3	Information 4
<u>Correlation</u>	?	?	?	?	?

**SOME NOTATIONS**

$f(x)$ : probability density function (pdf) of  $X$

$F(x)$ : cumulative distribution function (cdf) of  $X$

$u(x)$ : unit step function

$\sigma_x^2$ : Variance of  $X$

$$m_x^\pm = \int_{-\infty}^{\infty} xf(x)u(\pm x) dx$$

$$G(y) = F(y) - F(-y)$$

$$g(y) = f(y) - f(-y)$$

## INTEGRAL FORMULAS AND LIMITS

	<u>Integral formula</u>	<u>Property</u>
$\rho_{X_i R_i}$	$\frac{\sqrt{3}}{\sigma_x} \int_{-\infty}^{\infty} x \{2F(x) - 1\} f(x) dx$	$0 \leq \rho_{X_i R_i} \leq 1$
$\rho_{X_i Q_i}$	$\frac{\sqrt{3}}{\sigma_x} \int_{-\infty}^{\infty} x \{2G(x) - 1\} f(x) dx$	$\rho_{X_i Q_i} \leq \rho_{X_i R_i}$
$\rho_{ X_i  R_i}$	$\frac{\sqrt{3}}{\sqrt{\sigma_x^2 + 4m_x^+ m_x^-}} \int_{-\infty}^{\infty}  x  \{2F(x) - 1\} f(x) dx$	$\rho_{ X_i  R_i} \leq \rho_{ X_i  Q_i}$
$\rho_{ X_i  Q_i}$	$\frac{\sqrt{3}}{\sqrt{\sigma_x^2 + 4m_x^+ m_x^-}} \int_{-\infty}^{\infty}  x  \{2G(x) - 1\} f(x) dx$	$0 \leq \rho_{ X_i  Q_i} \leq 1$
$\rho_{Z_i R_i}$	$\sqrt{3F(0)\{1-F(0)\}}$	$0 \leq \rho_{Z_i R_i} \leq \frac{\sqrt{3}}{2}$
$\rho_{Z_i Q_i}$	$\frac{\sqrt{3}}{\sqrt{F(0)\{1-F(0)\}}} \left\{ F(0) - \int_{-\infty}^{\infty} F(-x) f(x) dx \right\}$	$ \rho_{Z_i Q_i}  \leq \frac{\sqrt{3}}{2}, \rho_{Z_i Q_i} \leq \rho_{Z_i R_i}$
$\rho_{R_i Q_i}$	$\begin{cases} 1 - 2F(0), & F(0) = 0, 1, \\ 12 \frac{n-1}{n+1} \left\{ \int_{-\infty}^{\infty} G( x ) F(x) f(x) dx - \frac{1}{4} \right\}, & 0 < F(0) < 1 \end{cases}$	$-1 \leq \rho_{R_i Q_i} \leq 1$

### NUMERICAL EXAMPLES

From the integral formulas, the seven correlation coefficients have been obtained for the following distributions:

Uniform distribution:

$$f_U(x) = \frac{1}{b-a} \{u(x-a) - u(x-b)\}, \quad b > a$$

A zero-mean asymmetric distribution:

$$f_a(x) = \begin{cases} \frac{a}{a+1}, & -1 \leq x < 0 \\ \frac{1}{a(a+1)}, & 0 \leq x < a \\ 0, & \text{elsewhere} \end{cases}$$

Even Distributions:

Gaussian, Laplace, and logistic distributions

Unilateral distributions:

Exponential, Rayleigh, gamma, and F distributions

Can you find any clue ?

## APPLICATION EXAMPLE

Correlation between statistics and performance of the detectors using the statistics

Results

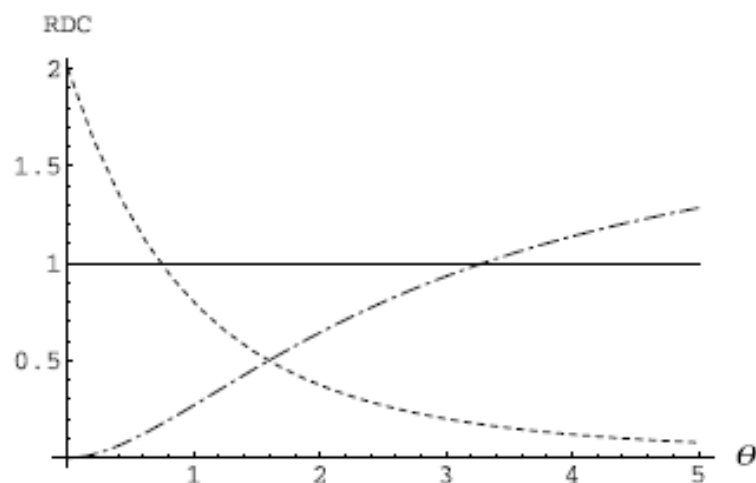


Fig. 2 Asymptotic performance comparisons in Laplace noise. (dashed:  $RDC_{S,L}(\theta)$ , dot-dashed:  $RDC_{M,L}(\theta)$ )

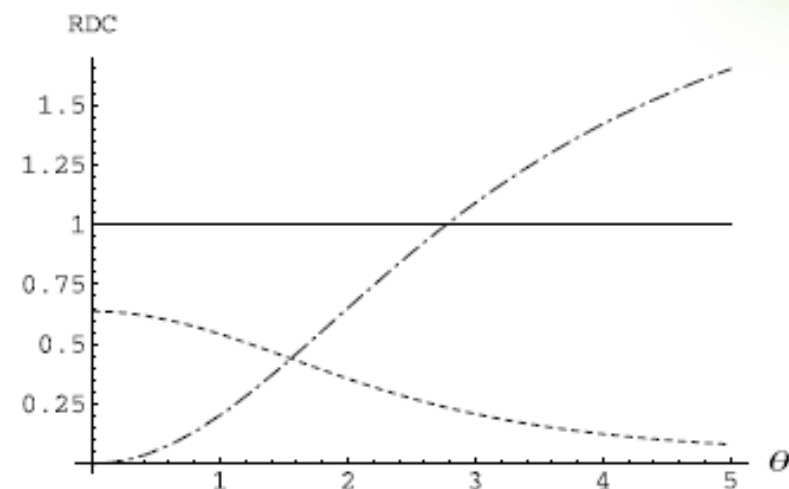


Fig. 3 Asymptotic performance comparisons in Gaussian noise. (dashed:  $RDC_{S,L}(\theta)$ , dot-dashed:  $RDC_{M,L}(\theta)$ )

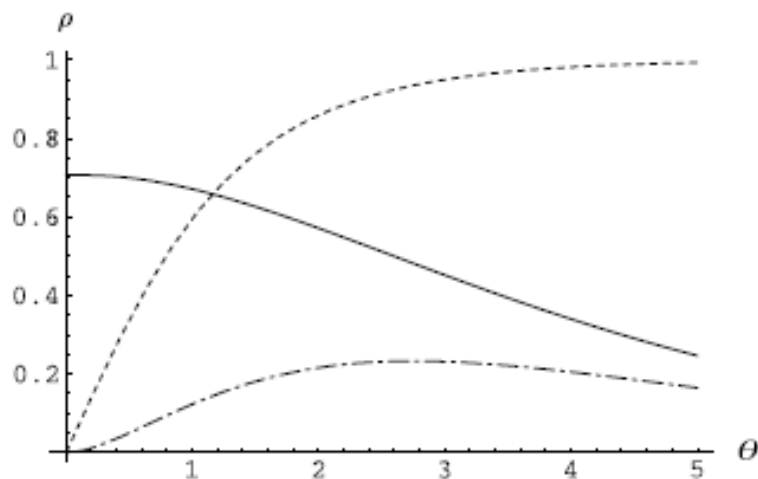


Fig. 4 Correlation coefficients for Laplace noise. (solid:  $\rho_{Z_i X_i}(\theta)$ , dashed:  $\rho_{X_i | X_i}(\theta)$ , dot-dashed:  $\rho_{Z_i | X_i}(\theta)$ )

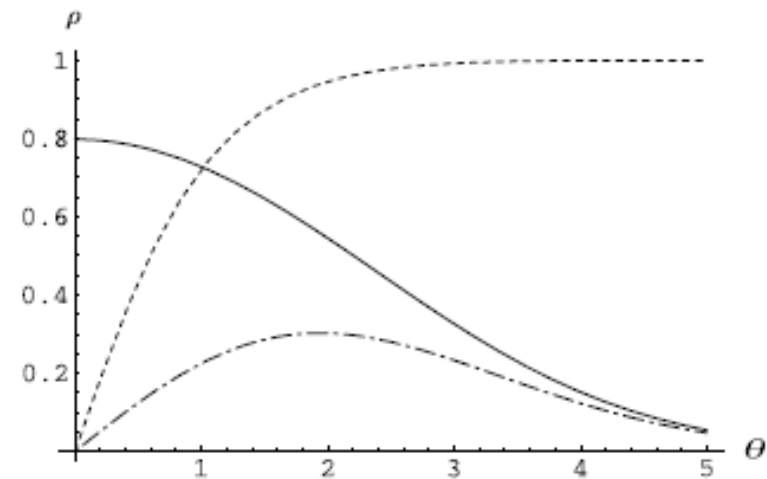


Fig. 5 Correlation coefficients for Gaussian noise. (solid:  $\rho_{Z_i X_i}(\theta)$ , dashed:  $\rho_{X_i | X_i}(\theta)$ , dot-dashed:  $\rho_{Z_i | X_i}(\theta)$ )

**A PERFORMANCE MEASURE BASED ON CORRELATION PERFORMANCE**

Shows relative performance of linear, sign, and magnitude detectors using correlation coefficients among the linear, sign, and magnitude statistics

$$M(\theta) = \frac{\theta^{-p} \rho_{Z_i|X_i}(\theta)}{\rho_{Z_i X_i}(\theta) - \rho_{X_i|X_i}(\theta)}, \quad p \geq 0$$



## SUMMARY OF RESULTS

### ¶ Closed formulas for correlation coefficients

We have 10 pairs of correlation coefficients in total. Three of them were thought to be trivial. So we concentrated on the rest of seven pairs. They are derived through the joint probability distributions among the statistics in i.i.d. random vectors, which are potentially applicable in detection theory.

### ¶ Lower and upper limits of the correlation coefficients

### ¶ Examples of distributions having the limits

### ¶ An outgrowth

The concept of independent and semi-identically distributed (i.s.i.d.) is introduced; All the elements have the identical distribution  $f(x)$  while the first element has another distribution  $h(x)$ . It is useful to derive some probability functions related to ranks..

## HOW TO HAVE THE CORRELATION COEFFICIENTS

Joint distribution, correlation coefficients, and limits



Joint distribution  
functions

Correlation  
coefficients

Limits /  
Examples

## **SUMMARY OF THE PRESENTATION**

- ¶ Maximum utilization of information is necessary to enhance detector performance in a low power communication system.
- ¶ Among the first steps is to address the bivariate correlation of statistics to investigate the information characteristics of the statistics
- ¶ Explicit integral formulas for the correlation coefficients of seven pairs among five statistics commonly used in signal detection are derived and upper and lower limits are also evaluated.