

Monica Borda

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# Fundamentals in Information Theory and Coding

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Springer

## **Author**

Prof. Dr. Eng. Monica Borda  
Technical University of Cluj-Napoca  
Dept. Communications  
Str. Baritiu 26-28  
400027 Cluj Napoca  
Romania  
Telephone: 0040-264401575  
E-mail: Monica.Borda@com.utcluj.ro

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To my family

# Preface

Motto: *We need to develop thinking, rather than too much knowledge.*  
*Democritus*

This book represents my 30 years continuing education courses for graduate and master degree students at the Electronics and Telecommunications Faculty from the Technical University of Cluj Napoca, Romania and partially my research activity too. The presented topics are useful for engineers, M.Sc. and PhD students who need basics in information theory and coding.

The work, organized in five Chapters and four Appendices, presents the fundamentals of Information Theory and Coding.

Chapter 1 (Information Transmission Systems - ITS) is the introductory part and deals with terminology and definition of an ITS in its general sense (telecommunication or storage system) and its role.

Chapter 2 (Statistical and Informational Model of an ITS) deals with the mathematical and informational modeling of the main components of a digital ITS: the source (destination) and the transmission channel (storage medium). Both memoryless and memory (Markov) sources are analyzed and illustrated with applications.

Chapter 3 (Source Coding) treats information representation codes (from the numeral system to the genetic code), lossless and lossy (DPCM and Delta) compression algorithms. The main efficiency compression parameters are defined and a detailed presentation, illustrated with many examples, of the most important compression algorithms is provided, starting with the classical Shannon-Fano or Huffman until the modern Lempel Ziv or arithmetic type.

Chapter 4 (Cryptography Basics) is presenting basics of classic and modern symmetric and public key cryptography. Introduction in DNA cryptography and in digital watermarking are ending the chapter. Examples are illustrating all the presented chipers.

Chapter 5 (Channel Coding) is the most extended part of the work dealing with error control coding: error detecting and forward error correcting codes. After defining the aim of channel coding and ways to reach it as established by Shannon second theorem, the elements of the theory of block codes are given and Hamming group codes are presented in detail.

Cyclic codes are a main part of Chapter 5. From this class, a detailed presentation of BCH, Reed-Solomon, Golay and Fire codes is given, with linear feedback shift register implementation. The algebraic decoding algorithms, Peterson and Berlekamp, are presented.

Concerning the convolutional codes, after a short comparison with block codes, a detailed description of encoding and graphical representation as well as decoding algorithms are given.

Principles of interleaving and concatenation are also presented and exemplified with the CIRC standard used in audio CD error control.

The principles of the modern and powerful Turbo Codes are ending the presentation of error control codes. Channel Coding chapter also includes a presentation of Base-Band coding.

The work also includes four Appendices (A, B, C and D) presenting: A – Algebra elements and tables concerning some Galois fields and generator polynomials of BCH and RS codes; B – Tables for information and entropy computing; C – Signal detection elements and D – Synthesis example.

I tried to reduce as much as possible the mathematical demonstrations, focusing on the conditions of theorems validity and on their interpretation. The examples were selected to be as simple as possible, but pointing out the essential aspects of the processing. Some of them are classic, others are taken from the literature, being currently standards in many real applications, but most of them are original and are based on typical examples taken from my lectures.

The understanding of the phenomenon, of the aims of processing (compression, encryption and error control) in its generality, not necessarily linked to a specific application, the criteria of selecting a solution, the development of the “technical good sense”, is the logic thread guiding the whole work.

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# Chapter 1

## Information Transmission Systems

Motto: *When desiring to master science, nothing is worst than arrogance and more necessary than time.*  
Zenon

### 1.1 Terminology

We call *information* “any message that brings a specification in a problem which involves a certain degree of uncertainty” [9]. The word information derived from the ancient Greek words “eidos” (idea) and “morphe” (shape, form), have thus, the meaning of form/shape of the mind.

Taking this definition into consideration we may say that *information* is a fundamental, abstract notion, as energy in physics.

Information has sense only when involves two correspondents: one generating it (the information source S) and another receiving it (the destination D, or the user U). Information can be transmitted at distance or stored (memorized) for later reading. The physical medium, including the contained equipment, that achieves the remote transmission of the information from S to D, is called *transmission channel* C; in the case of storage systems the channel is replaced by the *storage medium*, e.g. CD, tape etc.

Information is an abstract notion. This is why, when stored or transmitted, it must be embedded into a physical form (current, voltage, electromagnetic wave) able to propagate through the channel or to be stored. What we call *signal* is precisely this physical embodiment carrying information.

#### *Remark*

Generally speaking, by signal we understand any physical phenomenon able to propagate itself through a medium. One should notice that this definition is restrictive: it rules out the signal that interferes with the information-carrying signal (useful signal); this signal is known as *noise* or *perturbation* (N).

The information source can be discrete (digital source), or continuous (signal source). The discrete source generates a finite number of symbols (e.g. 0 and 1 used in digital communications) while the continuous source, an infinite number of symbols (e.g. voice, television signal, measurement and control signals).

### *Remark*

The sources, as well the destinations, are supposed to have transducers included. By *Information Transmission System (ITS)* we will understand the ensemble of interdependent elements (blocks) that are used to transfer the information from source to destination.

### *Remarks*

- When transmitting the information from source to a remote destination through a channel, we deal with a *transmission system*; on the other hand, when storing the information, we deal with a *storage system*. The problems met in information processing for storage are similar in many aspects to those from transmission systems; therefore in the present work the term information transmission system (ITS) will be used for the general case (transmission as well storage system).
- The signal, as well as the noise, are assumed to be random.

## 1.2 Role of an ITS

The role of an ITS is to ensure a high degree of fidelity for the information at destination, regardless to the imperfections and interferences occurring in the channel or storage medium. The accuracy degree is estimated using a fidelity criterion, as follows:

For analogue systems:

- *mean squared error*  $\varepsilon$ :

$$\varepsilon = \overline{[x(t) - y(t)]^2} \quad (1.1)$$

where  $x(t)$ ,  $y(t)$  are the signals generated by the source respectively received at destination; the symbol “ $\overline{\phantom{x}}$ ” indicates the time averaging.

- *signal/noise ratio (SNR)*  $\xi$ :

$$\xi = \frac{\overline{[y(t)]^2}}{\overline{[n(t)]^2}} \quad (1.2)$$

where  $n(t)$  indicates the noise.

For digital systems:

- *bit error rate (BER)*: the probability of receiving an erroneous bit

The degree of signal processing for transmission or storage, depends on the source, destination, channel (storage medium), the required accuracy degree, and the system cost.

When the source and destination are human beings, the processing may be reduced due to the physiological thresholds (hearing and vision), and also to the human brain processing, requiring a lower degree of fidelity.

When dealing with data transmissions (machines as source and destination), the complexity of processing increases in order to achieve the required fidelity.

For high quality data transmission/storage we may as well improve the channel (storage medium), the choice of the used method being made after comparing the

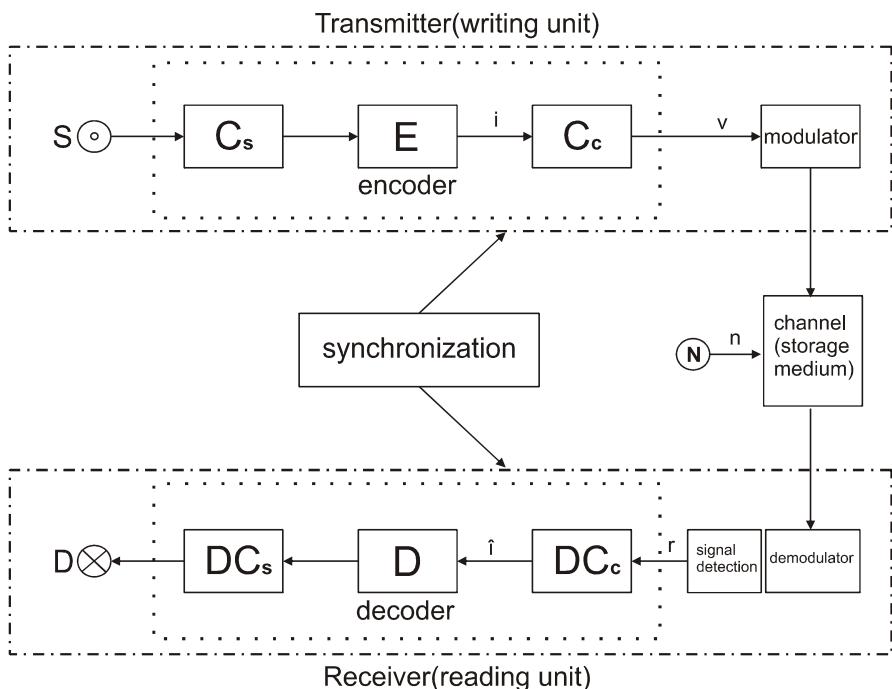
price of the receiver (the equipment used for processing) with the price of the channel (storage medium). The constant decrease of the LSI and VLSI circuits prices justifies the more and more increasing complexity of the terminal equipment, the ultimate purpose being the achievement of high quality transmission/storage.

*Remark*

In what follows we will exclusively analyze the numerical (digital) transmission systems taking into consideration their present evolution and the future perspectives that show their absolute supremacy even for applications in which the source and the destination are analogue (e.g. digital television and telephony).

### 1.3 Model of an ITS

The general block scheme of an ITS is presented in Fig. 1.1 which shows the general processing involving information: coding, modulation, synchronization, detection.



**Fig. 1.1** Block scheme of a general digital ITS

Legend:

- S/D – source/destination;
- $C_s/DC_s$  – source encoding/decoding blocks;
- E/D – source encryption/decryption blocks;

- $C_C/DC_C$  – channel encoding/decoding blocks;
- $i$  – information (signal)
- $v$  – encoded word
- $n$  – noise
- $r$  – received signal
- $\hat{i}$  – estimated information.

The process named *coding* stands for both encoding and decoding and is used to achieve the followings:

- matching the source to the channel/storage medium (if different as nature), using the source encoding block ( $C_S$ )
- ensuring efficiency in transmission/storage, which means minimum transmission time/minimal storage space, all these defining source compression ( $C_S$ )
- reliable transmission/storage despite channel/storage medium noise (error protection performed by the channel coding block  $C_C$ )
- preserving information secrecy from unauthorized users, using the source encryption/decryption blocks (E/D)

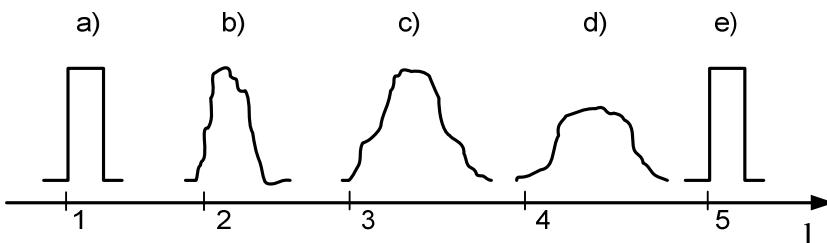
*Modulation* is used to ensure propagation, to perform multiple access and to enhance the SNR (for angle modulation), as well as to achieve bandwidth compression [8], [25].

For digital systems, *synchronization* between transmitter and receiver is necessary, and also *signal detection*, meaning that the receiver must decide, using the received signal, which of the digital signals has been sent [10].

In real applications, all the above-mentioned processes or only some of them could appear, depending on the processing degree required by the application.

### Why digital?

There are several reasons why digital systems are widely used. Their main advantage is high noise immunity, explained by signal regeneration: a digital signal, having only two levels corresponding to “0” and “1”, allows an easy regeneration of the original signal, even from a badly damaged signal (fig.1.2), without accumulation of regenerative errors in transmission (in contrast to analogue transmission) [5], [18].



**Fig. 1.2** Illustration of signal regeneration in digital communications: a) original signal, b) slightly distorted signal, c) distorted signal, d) intense distorted signal, e) regenerated signal (l - distance in transmission).

In analogue systems, the distortions, however small, cannot be eliminated by amplifiers (repeaters), the noise accumulating during transmission; therefore in order to ensure the required fidelity for a specific application, we must use a high SNR, unlike for digital systems in which (taking into account the possibility of error protection) we may use a very low SNR (lower than 10 dB, near Shannon limit [2]).

Other advantages of digital systems are:

- possibility of more flexible implementation using LSI and VLSI technologies
- reliability and lower price than for analogue systems
- identical analysis in transmission and switching for different information sources: data, telegraph, telephone, television, measurement and control signals (the principle of ISDN – Integrated Switching Digital Network)
- good interference and jamming protection and also the possibility of ensuring information confidentiality.

The main disadvantage of digital systems is the increased bandwidth compared to analogue ones. This disadvantage can be diminished through compression as well as through modulations, for spectrum compression.

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# Chapter 2

## Statistical and Informational Model of an ITS

Motto: *Measure is the supreme well.*  
*(from the wisdom of the peoples)*

### 2.1 Memoryless Information Sources

Let us consider a *discrete information source* that generates a number of  $m$  distinct symbols (messages). The set of all distinct symbols generated by the source forms the *source alphabet*.

A discrete source is called memoryless (*discrete memoryless source DMS*) if the emission of a symbol does not depend on the previous transmitted symbols.

The statistical model of a DMS is a discrete random variable (r.v.)  $X$ ; the values of this r.v. will be noted as  $x_i$ ,  $i = \overline{1, m}$ . By  $X=x_i$  we understand the emission of  $x_i$  from  $m$  possible.

The  $m$  symbols of a DMS constitute a *complete system of events*, hence:

$$\bigcup_{i=1}^m x_i = \Omega \quad \text{and} \quad x_i \cap x_j = \Phi, \forall i \neq j \quad (2.1)$$

In the previous formula,  $\Omega$  signifies the certain event or the sample space and  $\Phi$  the impossible event.

Consider  $p(x_i) = p_i$  the emission probability of the symbol  $x_i$ . All these probabilities can be included in the *emission probability matrix P(X)*:

$$P(X) = [p_1 \cdots p_1 \cdots p_m], \text{ where } \sum_{i=1}^m p_i = 1 \quad (2.2)$$

For a memoryless source we have:

$$p(x_i/x_{i-1}, x_{i-2} \dots) = p(x_i) \quad (2.3)$$

For the r.v.  $X$ , which represents the statistical model for a DMS, we have the *probability mass function (PMF)* of r.v.  $X$ :

$$X : \begin{pmatrix} x_i \\ p_i \end{pmatrix}, i = \overline{1, m}, \sum_{i=1}^m p_i = 1 \quad (2.4)$$

Starting from a DMS,  $X$ , we can obtain a new source, having messages which are sequences of  $n$  symbols of the initial source  $X$ . This new source,  $X^n$ , is called the *n-th order extension of the source X*.

$$\begin{aligned} X &: \binom{x_i}{p_i}, i = \overline{1, m}, \sum_{i=1}^m p_i = 1 \\ X^n &: \binom{m_j}{p_j}, j = \overline{1, m^n}, \sum_{j=1}^{m^n} p_j = 1 \\ \text{where } & \begin{cases} m_j = x_{j_1} x_{j_2} \dots x_{j_n} \\ p_j = p(x_{j_1}) p(x_{j_2}) \dots p(x_{j_n}) \end{cases} \end{aligned} \quad (2.5)$$

The source  $X^n$  contains a number of  $m^n$  distinct  $m_j$  messages formed with alphabet  $X$ .

### Example 2.1

Consider a binary memoryless source  $X$ :

$$X : \binom{x_1 \ x_2}{p_1 \ p_2}, p_1 + p_2 = 1$$

The 2nd order extension ( $n=2$ ) of the binary source  $X$  is:

$$X^2 : \binom{x_1 x_1 \ x_1 x_2 \ x_2 x_1 \ x_2 x_2}{p_1^2 \ p_1 p_2 \ p_2 p_1 \ p_2^2} = \binom{m_1 \ m_2 \ m_3 \ m_4}{p_1^* \ p_2^* \ p_3^* \ p_4^*}, \sum_{j=1}^4 p_j^* = 1$$

## 2.2 Measure of Discrete Information

As shown in 1.1, information is conditioned by uncertainty (non-determination).

Consider the DMS,  $X : \binom{x_i}{p_i}, i = \overline{1, m}, \sum_{i=1}^m p_i = 1$ . Prior to the emission of a symbol  $x_i$  there is an uncertainty regarding its occurrence. After the emission of  $x_i$  this uncertainty disappears, resulting the information about the emitted symbol. Information and uncertainty are closely connected, but not identical. They are inversely proportional measures, information being a removed uncertainty. It results that the information varies oppositely to the uncertainty.

The uncertainty regarding the occurrence of  $x_i$  depends on its occurrence probability:  $p_i$ , the both measures being connected through a function  $F(p_i)$  that increases as  $p_i$  decreases.

Defining the information  $i(x_i)$  as a measure of the a priori uncertainty regarding the realization of  $x_i$ , we can write:

$$i(x_i) = F(p_i) \quad (2.6)$$

In order to find a formula for the function  $F$  we impose that  $F$  carries all the properties that the information must have: