- Objectives
  - Transcription of information to facilitate coding
     code ⇒ signal (Transcoding)
  - Information compression
     reducing information size
  - Protection against transmission errors
     against loss and decision errors
  - Keeping transmitted information secret

Definition of a code

application of S in 
$$\mathcal{A} = \{ a_1, a_2, \dots, a_q \}$$

message  $m_i \in S \implies \text{code-word } M_i \in \mathcal{M} \text{ finite sequences of } \mathcal{A}$ 

### Information coding

■ Example of a simple source **S** that delivers 4 messages:

S 
$$\begin{cases} \bullet \ m_1, \ probability: \Pr(m_1) = 0,5 \\ \bullet \ m_2, \ probability: \Pr(m_2) = 0,25 \\ \bullet \ m_3, \ probability: \Pr(m_3) = 0,125 \\ \bullet \ m_4, \ probability: \Pr(m_4) = 0,125 \end{cases}$$

■ Variable length and fixed length Codes:

Messages Codes	m <sub>1</sub>	m <sub>2</sub>	m <sub>3</sub>	m <sub>4</sub>
Fixed length code	0 0	0 1	10	11
Variable length code	<b>1</b> 0	1 0	110	111

The variable length coding allows you to represent the messages more efficiently because it is based on the statistical properties of the source in opposition to the fixed length coding

Mean length of the fixed length code:

$$L_1 = 2$$
 bits

➤ Mean length of the *variable length code*:

$$L_2 = 1 \times 0.5 + 2 \times 0.25 + 3 \times 0.125 + 3 \times 0.125 = 1.75$$

The most probable messages e.g. m<sub>1</sub> are encoded with a low number of bits

#### Concept of separator characters

Difference between an irreducible variable length code and a reducible variable length code:

Messages Codes	m <sub>1</sub>	m <sub>2</sub>	m <sub>3</sub>	m <sub>4</sub>
Reducible code	1	10	100	1000
Irreducible code	0 <b>1</b>	1 0	110	111

- The *reducible* codes can not be decoded without ambiguity because the codewords of the symbols  $s_i$  are the prefixes of the code-words of the symbols  $s_j$  once i < j: it is necessary to add an *explicit separator*
- Example from the « code » of the English language:
  The word « seven » is the prefix of the word « seventeen », thus to know if we must read « seventeen » or « seven teen », we must add an explicit separator « space ».
- The *irreducible* code can be decoded *without ambiguity* because the codewords of the symbols s<sub>i</sub> cannot be the prefixes of the code-words s<sub>j</sub>. In that case, the *separators* are *implicit* (e.g. Huffman coding)

- Alphabet  $A = \{ a_1, a_2, ..., a_q \}$
- Finite set of messages S = {  $m_1$  ,  $m_2$  , ...,  $m_i$  , ....,  $m_N$  } Coding  $C = { <math>M_1$  ,  $M_2$  , ...,  $M_i$  , ....,

$$M_N$$

- Length of code-words:  $n_i = n (M_i)$
- Average length of code-words: E ( n) =  $\sum_{i=1;N} p_i n_i$
- Entropy of the source H:  $H(p_1, ..., p_N) \le \log_2 N$
- Average quantity of information per character = H / E(n) or H / E(n)  $\leq \log_2 q = E(n) \geq H / \log_2 q$
- Flow of a source of information coded with an average D characters per second: R = D H/E(n)

$$\Rightarrow$$
 R  $\leq$  D log<sub>2</sub> q R in bits/second

#### Coding and decoding information

- *Efficiency*  $\eta$  of a code:  $\eta = n_{min} / E(n) => \eta = H / (E(n) \log_2 q)$
- *Redundancy*  $\rho$  of a code :  $\rho = 1 \eta$
- Simple examples: codes  $C_1$  and  $C_2$
- **Constraints**: separation of code-words & unambiguous reading of code-words => *regular and inverting codes*
- Regular code: if  $m_i \neq m_j ==> M_i \neq M_j$  (injective application)
- *Inverting codes*: 2 sequences of distinct messages
  - ==> 2 sequences of distinct codes
  - if  $(m_{\alpha 1},...,m_{\alpha i}) \neq (m_{\beta 1},...,m_{\beta j}) => (M_{\alpha 1},...,M_{\alpha i}) \neq (M_{\beta 1},...,M_{\beta j})$ examples: fixed length codes; codes with separator
- *Irreducible code*: inverting code that can be decoded without any device  $M_i$  is not a prefix of  $M_j \forall i, j$

#### Code examples

#### Regular codes / Inverting codes / Irreducible codes

Messages Proba.	m <sub>1</sub> 0.5	m <sub>2</sub> 0.25	m <sub>3</sub> 0.125	m <sub>4</sub> 0.125
$\mathbf{C}_1$	1	1	0	00
$C_2$	0	1	11	01
$C_3$	1	01	001	000
$C_4$	1	10	100	1000

- $\triangleright$  C<sub>1</sub> is a non regular code
- $\triangleright$  C<sub>2</sub> is a non-inverting code
- $\triangleright$  C<sub>3</sub> is an inverting and irreducible code
- $\triangleright$  C<sub>4</sub> is only an inverting code

Information data coding  $\equiv$  coded representation of information

	Injective correspondence	
Message		$\{b_n\}$

- > Multiples roles of coding
  - Preparing the transformation message => transmitted signal
  - Adapting the source bit rate channel capacity (compression)
  - Protective encoding against transmission errors (error detection / correction)
  - Encrypting (secretive communications)
  - Tattooing (ownership markers)
  - Transcoding (alphabet changes, transmission constraints )

#### Definitions

- Message sources S: production of a sequence of messages, each of them being selected in a set M of messages
   (M: codebook of possible messages M = / m m m
  - ( M: codebook of possible messages  $M = \{ m_1, m_2, .... \}$ , the  $m_i$  are also called "words")
- Message: finite sequence of symbols
   (characters taken from A: alphabet)
- Alphabet: finite set of symbols  $A = \{a_1, a_2, \dots, a_k\}$

#### Entropy of a source (SHANNON 1948)

- Definition of *uncertainty* and of *entropy* 
  - Uncertainty I of an event E:

$$I(E) = -\log_2 \Pr\{E\} \qquad \textit{Units:} \ \text{bit (BInary uniT if log}_2)$$
 
$$\text{nat (NAtural uniT if Log}_e): 1 \ \text{nat} = 1.443 \ \text{bits}$$
 if source simple  $s_n = > I(s_n) = \sum_{i=1;n} I(m_{\alpha i})$ 

Entropy H of a discrete random variable X:

$$H(X) = E_X [I(X)] = \sum_{i=1;n} p_i I(X_i) = -\sum_{i=1;n} p_i \log_2(p_i)$$

- Properties of entropy
  - $H \ge 0$ ; H is continuous, symmetrical;  $H(p_1, ..., p_N) \le \log_2 n$
  - if  $(p_1, ..., p_n)$  and  $(q_1, ..., q_n)$  are 2 distributions of probabilities

$$= > \sum_{i=1:n} p_i \log_2(q_i/p_i) \le 0$$
 car Log x < x - 1

# Optimal statistical coding

#### • Definitions:

- S: discrete and simple source of messages  $m_i$  with probability law  $p = (p_1, ..., p_N)$  (homogeneous source)
- Coding of an alphabet  $A = \{ a_1, a_2, \dots, a_q \}$
- Entropy of the source H(S) and average length of code-words E(n)

#### • MacMillan's theorem:

- There exists at least one irreducible inverting code that matches:

$$H / log2 \ q \le E(n) < (H / log2 \ q) + 1$$
  
 $\Rightarrow$  Equality if  $p_i$  of the form:  $p_i = q^{-ni}$  (if  $q = 2 = n_i = -log2 \ p_i$ )

• Shannon's theorem (1st theorem on noiseless coding)  $H / log2 q \le E(n) < (H / log2 q) + \varepsilon$ 

# Optimal statistical coding

• Fano - Shannon coding

- Arithmetic coding (block encoding, interval type encoding) possibilities of on line adaptation
- Huffman coding
  - 3 basic principles:
  - if  $p_i < p_j \Rightarrow n_i \ge n_j$
  - the 2 unlikeliest codes have the same length
  - the 2 unlikeliest codes (of max length) have the same prefix of length  $n_{\text{\scriptsize max}}\text{-}1$