

### Class no 3 :-

Signals  $\rightarrow$  Carry Information

Comm  $\rightarrow$  Reconstructing info at Rx end.

But what is information?

$\rightarrow$  Possible answers:

$\rightarrow$  Anything interesting

$\rightarrow$  Part of Data collected which is "useful"

$\rightarrow$  What is interesting is something 'unexpected'

— Information of any outcome has to do with 'uncertainty' of that outcome.

'new'  
'novel'

'unexpected'

$\rightarrow$  Indicate  
'high level of information.'

Information deals with things/signals we don't know precisely  
but we are interested  
to find out

Say that  $X$  is a random quantity representing  
the signal of interest (at some pt of 'time' or 'space')

Example:  $X \in \{0, 1\}$  & can take <sup>value</sup> 0 with  
probability  $p$ , & value 1 with prob  $1-p$ .

$\rightarrow$  General abstraction of many real  
world scenarios

$X$  is also technically called a 'Random Variable'.

What is the information content in  $X$ ?

"Average uncertainty or surprise" in  $X$ ?

Information content in a particular event  $\propto$  Inversely proportional to  $P(\text{event})$

(here there are 2 possible outcomes  $\{0, 1\}$  & 2 corresponding events  $X=0$  &  $X=1$ )

For ex:

Information content in event " $X=0$ "

$$\propto \frac{1}{P(X=0)}$$

ditto  $\propto \frac{1}{P(X=1)}$

What fn can we assign to "Information content"?

$\rightarrow$  Suppose  $X_1, X_2$  are independent random variables

we expect the

'joint information content in  $X_1$  &  $X_2$ '

= Sum of Individual Info content

$$\begin{aligned} P(X_1 = x_1, X_2 = x_2) \\ \downarrow \text{some value} \quad \downarrow \text{some value} \\ = P(X_1 = x_1) P(X_2 = x_2) \\ \forall \text{ outcomes } x_1, x_2 \end{aligned}$$

$\rightarrow$  Thus product of probabilities has to convert into Sum of Information content Base 2

So for 'Info Content' in event  $X=x$ , the  $\log_2\left(\frac{1}{P(X=x)}\right)$  is a good choice of fn.

$$\left[ \begin{array}{l} \text{Note: } \log\left(\frac{1}{P(X_1=x_1, X_2=x_2)}\right) \\ \text{if } X_1, X_2 \text{ are independent} \end{array} \right] = \log_2 \frac{1}{P(X_1=x_1)} + \log_2 \frac{1}{P(X_2=x_2)}$$

The 'Info content' in event  $X = x$

is assumed to be  $\log \frac{1}{P(X=x)}$

↖ some value  
which  $X$  can  
take

So the 'average' info content ('expected' info content)

Entropy in  
Random variable  $X$

$$\sum_{x \in \text{all possible values taken by } X} p(X=x)$$

$$\left[ \log_2 \frac{1}{P(X=x)} \right]$$

denoted by

$$H(X)$$

(Notation " $\triangleq$ " denotes that LHS is "defined as" RHS)

Lemma:

Suppose  $X_1 \in \mathcal{X}_1$  &  $X_2 \in \mathcal{X}_2$

are independent random variables.

$$\text{Then } H(X_1, X_2) = H(X_1) + H(X_2)$$

where

$$H(X_1, X_2) \triangleq \sum_{\substack{x_1 \in \mathcal{X}_1 \\ x_2 \in \mathcal{X}_2}} P(X_1=x_1, X_2=x_2) \log \frac{1}{P(X_1=x_1, X_2=x_2)}$$

↓  
"Joint entropy of  
 $X_1$  &  $X_2$ "

Proof:

Use the fact that  $X_1, X_2$  are indep &

$$\text{the fact that } \sum_{x_1 \in \mathcal{X}_1} P(X_1=x_1) = 1 = \sum_{x_2 \in \mathcal{X}_2} P(X_2=x_2)$$

in defn of  $H(X_1, X_2)$  and

prove the result. [Exercise for Monday, 31<sup>st</sup> May]