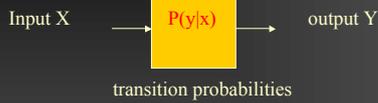


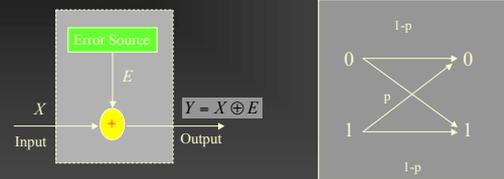
some channel models



memoryless:

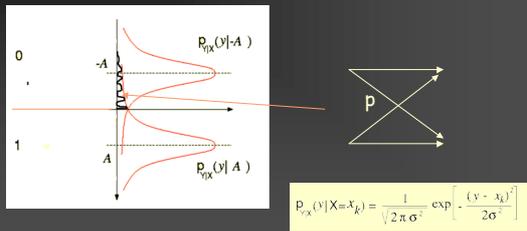
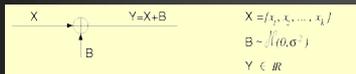
- output at time i depends only on input at time i
- input and output alphabet finite

Example: binary symmetric channel (BSC)



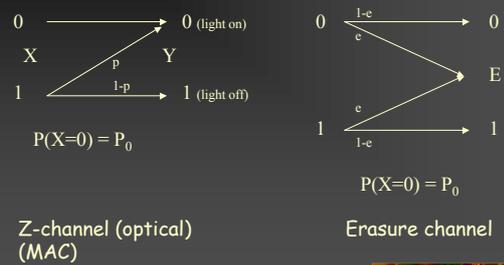
E is the **binary error sequence** s.t. $P(1) = 1 - P(0) = p$
 X is the **binary information sequence**
 Y is the **binary output sequence**

from AWGN to BSC

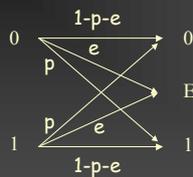


Homework: calculate the capacity as a function of A and σ^2

Other models

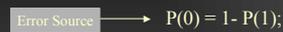


Erasure with errors

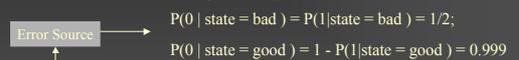


burst error model (Gilbert-Elliot)

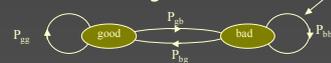
Random error channel; outputs independent



Burst error channel; outputs dependent



State info: good or bad



transition probability

channel capacity:

$$I(X;Y) = H(X) - H(X|Y) = H(Y) - H(Y|X) \text{ (Shannon 1948)}$$



$$\max I(X;Y) = \text{capacity}$$

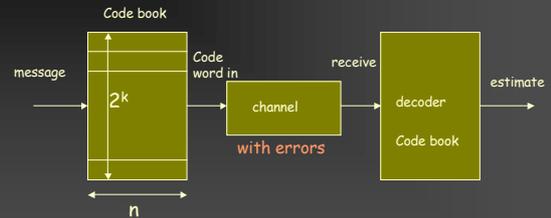
$H = \text{Entropy}$

$$E(p) = \sum p(i) * I(i)$$

notes:

capacity depends on input probabilities
because the transition probabilities are fixed

Practical communication system design



There are 2^k code words of length n

k is the number of information bits transmitted in n channel uses

Channel capacity

Definition:

The rate R of a code is the ratio k/n , where

k is the number of information bits transmitted in n channel uses

Shannon showed that: :

for $R \leq C$

encoding methods exist

with decoding error probability $\rightarrow 0$

Encoding and decoding according to Shannon

Code: 2^k binary codewords where $p(0) = P(1) = \frac{1}{2}$

Channel errors: $P(0 \rightarrow 1) = P(1 \rightarrow 0) = p$

i.e. # error sequences $\approx 2^{nh(p)}$

Decoder: search around received sequence for codeword
with $\approx np$ differences



decoding error probability

1. For ϵ errors: $|t/n-p| > \epsilon$

$\rightarrow 0$ for $n \rightarrow \infty$

(law of large numbers)

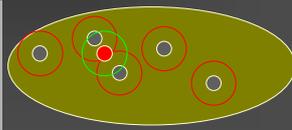
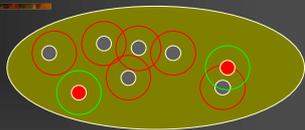
2. > 1 code word in region
(codewords random)

$$P(> 1) \approx (2^k - 1) \frac{2^{-nh(p)}}{2^n}$$

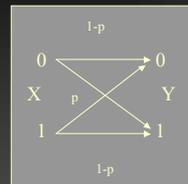
$$\rightarrow 2^{-n(1-h(p)-R)} = 2^{-n(C_{BSC}-R)} \rightarrow 0$$

for $R = \frac{k}{n} < 1 - h(p)$

and $n \rightarrow \infty$



channel capacity: the BSC



$$I(X;Y) = H(Y) - H(Y|X)$$

the maximum of $H(Y) = 1$

since Y is binary

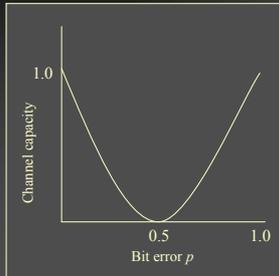
$$H(Y|X) = h(p)$$

$$= P(X=0)h(p) + P(X=1)h(p)$$

Conclusion: the capacity for the BSC $C_{BSC} = 1 - h(p)$

Homework: draw C_{BSC} , what happens for $p > \frac{1}{2}$

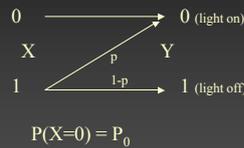
channel capacity: the BSC



Explain the behaviour!

channel capacity: the Z-channel

Application in optical communications



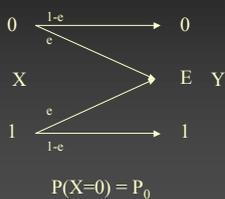
$$H(Y) = h(P_0 + p(1 - P_0))$$

$$H(Y|X) = (1 - P_0) h(p)$$

For capacity, maximize $I(X;Y)$ over P_0

channel capacity: the erasure channel

Application: cdma detection



$$I(X;Y) = H(Y) - H(Y|X)$$

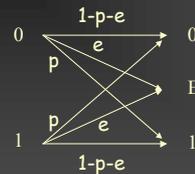
$$H(Y) = h(P_0)$$

$$H(Y|X) = e h(P_0)$$

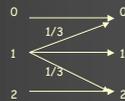
$$\text{Thus } C_{\text{erasure}} = 1 - e$$

(check: draw and compare with BSC and Z)

Erasure with errors: calculate the capacity!



example



■ Consider the following example

■ For $P(0) = P(2) = p, P(1) = 1-2p$

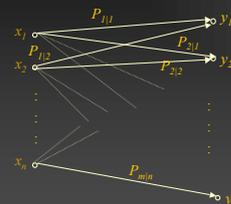
$$H(Y) = h(1/3 - 2p/3) + (2/3 + 2p/3); H(Y|X) = (1-2p)\log_2 3$$

Q: maximize $H(Y) - H(Y|X)$ as a function of p

Q: is this the capacity?

hint use the following: $\log_2 x = \ln x / \ln 2; d \ln x / dx = 1/x$

channel models: general diagram



Input alphabet $X = \{x_1, x_2, \dots, x_n\}$

Output alphabet $Y = \{y_1, y_2, \dots, y_m\}$

$$P_{ji} = P_{Y|X}(y_j | x_i)$$

In general: calculating capacity needs more theory

The statistical behavior of the channel is completely defined by the channel transition probabilities $P_{ji} = P_{Y|X}(y_j | x_i)$

* clue:

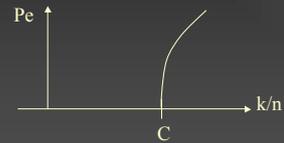
$I(X;Y)$

is convex \cap in the input probabilities

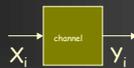
i.e. finding a maximum is simple

Channel capacity: converse

For $R > C$ the decoding error probability > 0



Converse: For a discrete memory less channel



$$I(X^n; Y^n) = H(Y^n) - \sum_{i=1}^n H(Y_i | X_i) \leq \sum_{i=1}^n H(Y_i) - \sum_{i=1}^n H(Y_i | X_i) = \sum_{i=1}^n I(X_i; Y_i) \leq nC$$

Source generates one out of 2^k equiprobable messages



Let P_e = probability that $m' \neq m$

converse $R := k/n$

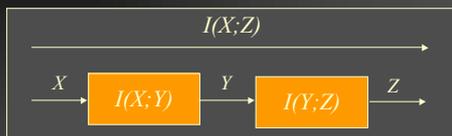
$$\left. \begin{aligned} k = H(M) &= I(M; Y^n) + H(M | Y^n) \\ &\leq \underbrace{I(X^n; Y^n)}_{X^n \text{ is a function of } M} + \underbrace{1 + k P_e}_{\text{Fano}} \\ &\leq nC + 1 + k P_e \end{aligned} \right\} 1 - Cn/k - 1/k \leq P_e$$

$$P_e \geq 1 - C/R - 1/nR$$

Hence: for large n , and $R > C$, the probability of error $P_e > 0$

We used the data processing theorem

Cascading of Channels



The overall transmission rate $I(X;Z)$ for the cascade can not be larger than $I(Y;Z)$, that is:

$$I(X;Z) \leq I(Y;Z)$$