

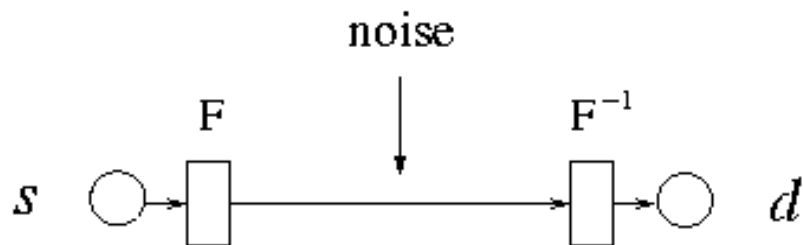
## Information transmission under noise

How much throughput can we get in a network link that is subject to noise

→ reliable throughput

→ different models of noise

Set-up:



To communicate symbol  $a \in \Sigma$  send code word  $w_a$ :

$$a \mapsto w_a \mapsto w \mapsto ?$$

→  $w_a$  gets corrupted and becomes  $w$

→ if  $w = w_b$  for  $b \neq a$ , incorrectly conclude  $b$  was sent

Want  $F^{-1}$ :

- detect  $w$  has been corrupted  
→ error detection
- correct  $w$  back to  $w_a$   
→ error correction

Coding theory

→ error model

→ e.g., how many bit flips, bit flip pattern

Examples:

- 1-bit flip detection: parity bit
- 1-bit flip correction: majority vote  
→ 3-fold redundancy

Error detection:

- to communicate symbol  $a \in \Sigma$ , code word  $w_a$  is transmitted
- $k$  bit flips change  $w_a$  into  $w$
- to detect  $k$ -bit error,  $w \neq w_b$  for any  $b \in \Sigma$   
→ i.e.,  $w$  must not be a valid code word

Conceptually: code words live in higher dimensional space than symbols

→ e.g., if  $a$  is  $n$  bits long,  $w_a$  is  $m$  bits long where  $m > n$

Distance between code words  $d(w_a, w_b) > k$

→ Hamming distance (e.g.,  $d(0001, 0100) = 2$ )

→ detect up to  $k$  bit flips

→ necessary and sufficient condition

Error correction: to correct  $k$ -bit error,  $d(w, w_a) < d(w, w_b)$   
for any  $b \neq a$

→ although  $w_a$  distorted into  $w$ ,  $w$  most resembles  $w_a$

→ minimum distance matching

Geometrically: balls of radius  $k$  centered at code words  
must not intersect

→  $B_k(w_a) \cap B_k(w_b) = \emptyset$

→ necessary and sufficient

Error detecting and correcting code constructed using algebra over finite fields

→ e.g., CRC (cyclic redundancy check)

Shannon's result on reliable communication

→ fundamental limit

→ upper bound on bps

→ depends only on bandwidth of physical link (Hz) and relative noise (dB)

Channel Coding Theorem (Shannon's 2nd Theorem): Given bandwidth  $W$  of physical link, signal power  $P_S$ , noise power  $P_N$ , link subject to white noise,

$$C = W \log \left( 1 + \frac{P_S}{P_N} \right) \text{ bps}$$

→  $P_S/P_N$ : signal-to-noise ratio (SNR)

→ increasing power yields logarithmic gain

Implications for networking:

- increase bandwidth  $W$  (Hz) to proportionally increase reliable throughput
  - e.g., FDM, OFDM
  - width not absolute frequency
  - what about AM (or PCM)?
- power control (e.g., handheld devices)
  - logarithmic gain
  - accelerates battery power depletion
  - multi-user interference: doesn't work if everyone increases power
  - signal-to-interference ratio (SIR)
  - in general: SINR

Signal-to-noise ratio (SNR) expressed as

$$\text{dB} = 10 \log_{10}(P_S/P_N)$$

Example: assuming a decibel level of 30, what is the channel capacity of a telephone line?

First,  $W = 3000$  Hz,  $P_S/P_N = 1000$ . Using Channel Coding Theorem,

$$C = 3000 \log 1001 \approx 30 \text{ Kbps.}$$

→ compare against 28.8 Kbps modems

→ what about 56 Kbps modems?

→ incorrect assumptions

Last but not least: bandwidth (Hz) of signal  $s(t)$

→ e.g., audio

Application: digitize analog signal

→ discrete time: sampling

→ discrete amplitude: quantization

Focus: digitize time so that fidelity is preserved

→ continuous time signal to discrete time samples

→ from discrete time samples back to continuous time signal

→ original replica



Sampling Theorem (Nyquist): Given continuous bandlimited signal  $s(t)$  with bandwidth  $W$  (Hz),  $s(t)$  can be reconstructed from its samples if

$$\nu > 2W$$

where  $\nu$  is the sampling rate (unit: samples per second).

Human auditory system:

- sensitivity: 20 Hz–20 KHz range (roughly 20 KHz)
- voice: 300 Hz–3.3 KHz (roughly 4 KHz)
- 8000 samples per second
- note T1 line

CD quality audio: 44100 samples per second

- also denoted Hz (44.1 KHz)