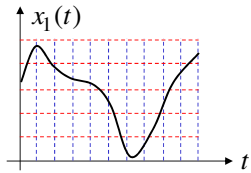


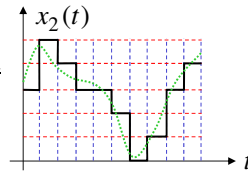
## Analog, Time discrete and Digital signals

Analog signal



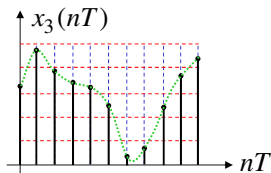
- Continuous time
- Continuous amplitude

Quantized signal



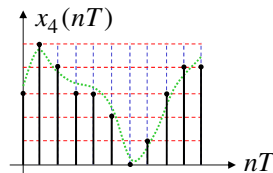
- Continuous time
- Quantized amplitude

Sampled signal:



- Quantized time (time discrete signal)
- Continuous amplitude

Digital signal:



- Quantized time
- Quantized amplitude (e.g. 8 bit/sample)

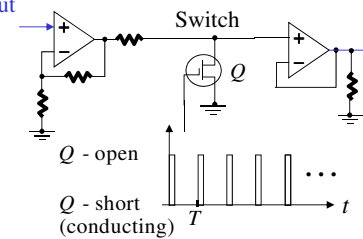
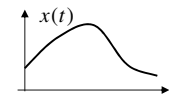
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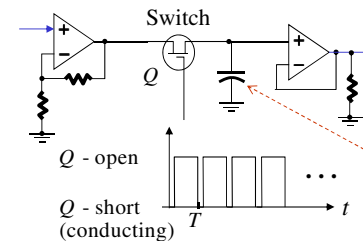
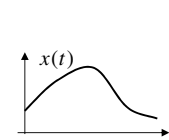
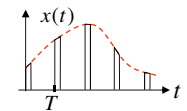
Digital Mod 2

## Pulse Amplitude Modulation (PAM)

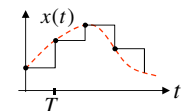
Analog input



Natural sampling



Flat-top sampling, or sample and hold output



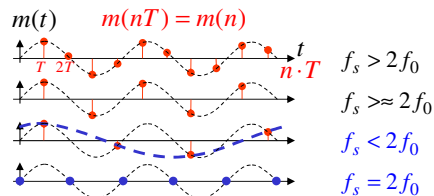
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Digital Mod 3

## The Sampling Theorem

How often must a time continuous signal be sampled to preserve all information (so that it is possible to accurately reconstruct it)?

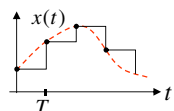


### The sampling theorem:

A band limited time continuous signal  $x(t)$  can be fully reconstructed by an ideal LP filter from its sampled values  $x(nT)$  if the sampling frequency is at least two times the highest frequency component  $f_0$  in the signal (i.e. two times the baseband bandwidth)  $f_s > 2f_0$ .

Reconstruction by an ideal LP filter is of course not possible. Normally the reconstruction is done by a hold circuit and a LP filter (anti-imaging filter).

Zero order hold D/A conversion:



The hold circuit gives a staircase representation, and this signal is then smoothed by an analog LP filter, removing what is left of the higher frequency replica from the periodic spectrum.

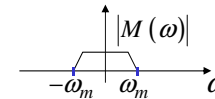
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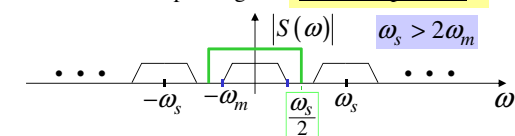
Digital Mod 4

## Aliasing

Band limited information signal

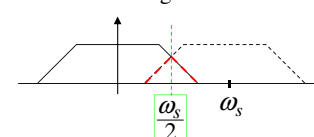


Sampled signal: Periodic spectrum!

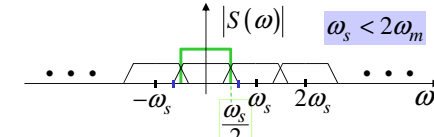


The signal can be reconstructed by an ideal LP-filter.

When the sampling frequency is too low, we get aliasing (vinkningsdistortion) and the signal cannot be reconstructed!



Foldover-frequency (Vinknings-frekvens)



### Examples of aliasing:

- Propeller (airplane)
- Spokes in a wheel
- Stroboscope

The velocity seen by the eye is often not correct!

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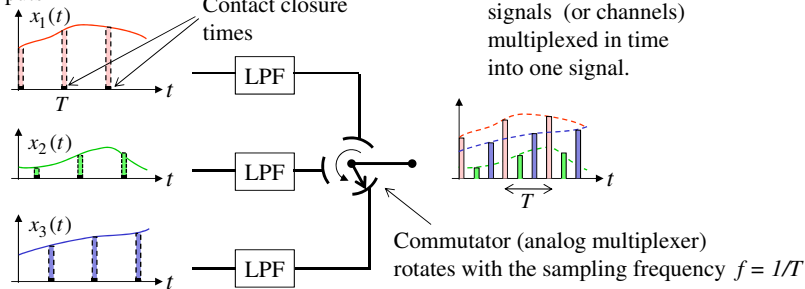
Digital Mod 5

AM

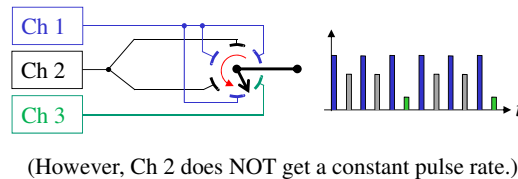
## Time discrete signals and TDM

### TDM – Time Division Multiplex

Analog inputs



The commutator can be more complex to ensure minimum pulse rate if the analog input signal have different bandwidths and thus different sampling frequency requirements.



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Digital Mod 6

AM

## Pulse Modulation methods

PAM – Pulse Amplitude Modulation

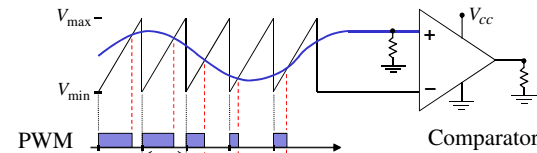
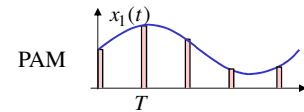
PWM – Pulse Width Modulation

(or number of equally spaced pulses)

PPM – Pulse Position Modulation

(needs a reference – synchronization)

PFM – Pulse Frequency Modulation

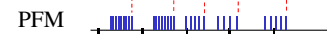


### Simple PWM modulator:

Here the amplitudes and thus the sample times are given by the end of the pulses, and thus they are NOT equally spaced.



Here drawn based on the PWM signal.



Could of course also be based on equally spaced sample values.

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Digital Mod 7

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## PCM and Baseband Coding

- PCM – Pulse Code Modulation
- DPCM – Differential PCM
- DM – Delta Modulation
- Baseband Coding

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Digital Mod 8

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## Speech (telephone), PCM-modulator

### Speech:

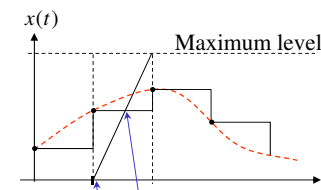
$$300 \text{ Hz} - 3400 \text{ Hz} \Rightarrow B = 3100 \text{ Hz}$$

$$f_s \geq 2 f_{\max} \Rightarrow f_s = 8000 \text{ Hz}$$

sufficient quality with  $2^8 = 256$  levels  
(- found from fysiological testing)

### PCM = Pulse Code Modulation

### PCM-modulator, Ramp encoder:



Start Stop  
using a binary counter with 8 bits

Stop the binary counter when the signal has reached the level of the sample and hold circuit.

Basic building block in classical telecommunication:

$$D = 8 \left[ \frac{\text{bit}}{\text{samples}} \right] \cdot 8k \left[ \frac{\text{samples}}{\text{sec}} \right] = 64k \left[ \frac{\text{bit}}{\text{sec}} \right] \quad \text{Bitrate} = 64k \text{ bps}$$

The term **PCM** is often used with this specific definition of 64 k bps.

However, PCM is also often used generally for any digital signal from a sampled analog signal like above (with arbitrary bitrate).

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Digital Mod 9

## Comparison of SNR due to quantization

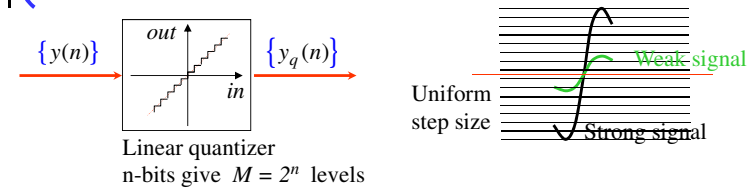
PCM = Pulse Code Modulation

Ordinary PCM has  $n = 8$  bits, and number of levels:  $M = 2^n = 2^8 = 256$

The introduced quantization error gives:  $\left(\frac{S}{N}\right)_q \approx M^2 = (2^n)^2 = 2^{2n}$   
(See end of file for the derivation!)

	Phone (USA)	Phone (Europe)	CD (Compact Disk)
Sampling frequency	$f_s = 8$ kHz	8 kHz	44.1 kHz
bits	$n = 7$	8	16
levels	$M = 128$	256	$2^{16} = 65536$
$(S/N)_q$	$2^{(2n)} = 2^{14}$	$2^{16}$	$2^{32}$
$(S/N)_q$ in dB	42 dB	48 dB	96 dB

## Quantization

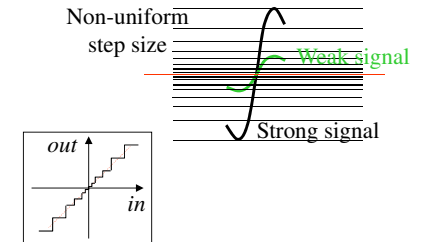


Two major drawbacks of linear quantization:

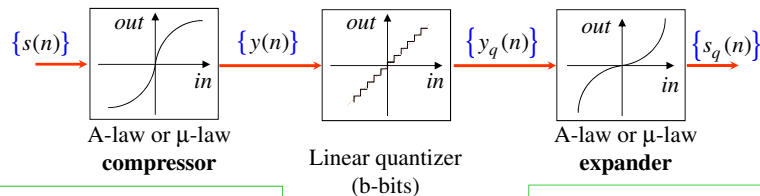
- The uniform step size means that weak analog signals will have much poorer  $(S/N)_q$  than strong signals.
- Systems with wide dynamic range require many bits and thus large bandwidth.

Non-linear quantization:

- Decrease the step size for weak analog signals and increase it for strong signals.
- This gives a more uniform relative quantization error or uniform  $(S/N)_q$  !



## Compression/Expansion = Companding

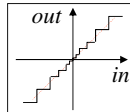


An analog voltage compressor (which also limits the amplitude) precedes the linear quantizer.

A complementary expander (after decoding) restores the original dynamic range.

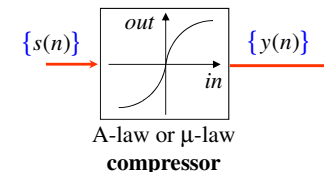
The analog compression / expansion could also be done digitally, in order to save bits in e.g. a digital transmission, starting with a high sampling rate signal.

The above is equivalent to a non-linear quantizer.



See also: <http://www.dspguide.com/ch22/5.htm>

## PCM A-law (or $\mu$ -law)



North America uses AT&T's so-called  $\mu$ -255 companding shape (the 'mu'-law).

sign function

input

output

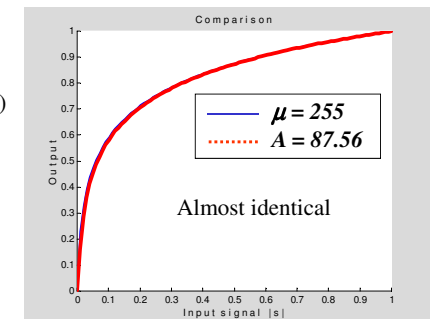
$$y = \frac{\ln(1 + \mu|s|)}{\ln(1 + \mu)} \text{sgn}(s), \quad |s| \leq 1, \quad |y| \leq 1$$

$\mu$ -law expander:

$$|s| = \frac{(1 + \mu)^{|y|} - 1}{\mu}$$

Europe uses the CCITT (now ITU) specification, the so-called 'A'-law ( $A = 87.56$ )

$$y = \begin{cases} \frac{1 + \ln(A|s|)}{1 + \ln A} \text{sgn}(s), & \frac{1}{A} \leq |s| \leq 1 \\ \frac{A|s|}{1 + \ln A} \text{sgn}(s), & 0 \leq |s| \leq \frac{1}{A} \end{cases}$$



## Differential PCM and Delta Modulation

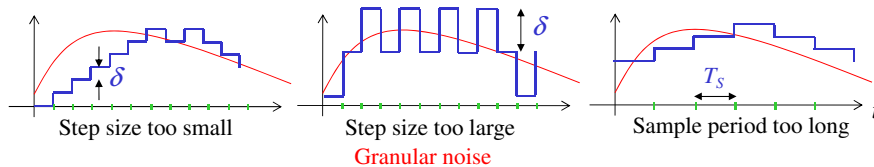
### Differential PCM

Use the available number of bits to represent the difference in amplitude between two sample points, instead of representing the full amplitude. Then the quantization error is much smaller.

### Delta Modulation (DM)

By increasing the sampling frequency the difference amplitude will be small. Go to the extreme and use only one bit to represent this difference.

The design parameters sampling frequency (or sampling period  $T_s$ ) and step size (delta) need to be chosen carefully.

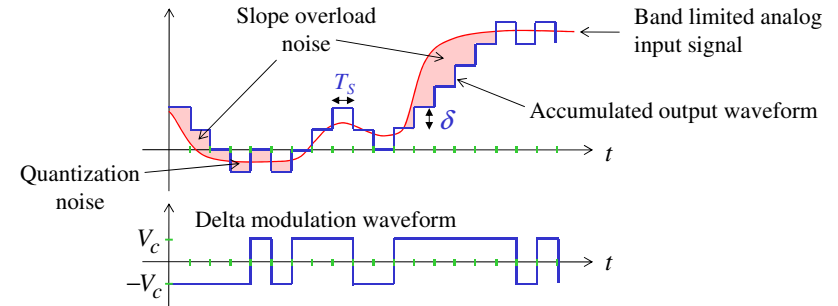


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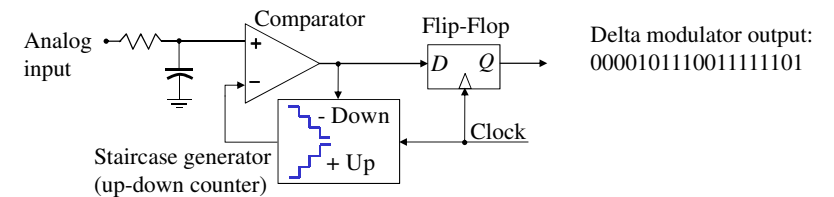
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Digital Mod 14

## Delta Modulation (DM)



### Delta modulator principle:



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Digital Mod 15

## Analog ↔ Time discrete ↔ Digital

Analog signal

Sampling (Nyquist)

Time discrete signal → PAM, PWM, PPM. TDM (Time Div. Multiplex)

Quantization

Digital signal

- PCM
- DPCM
- DM

Base band "modulation"

Coding:

- NRZ
- Bipolar
- RZ
- AMI
- Manchester
- Differential code

"Matching" to the baseband channel.  
(See Young Fig 12-10)

- ASK
- FSK
- PSK
- QAM
- MSK

Digital modulation

(High frequency modulation using carrier)

(Minimum Shift Keying, used in mobile phone GSM)

The use of the terms are a bit "sloppy"!

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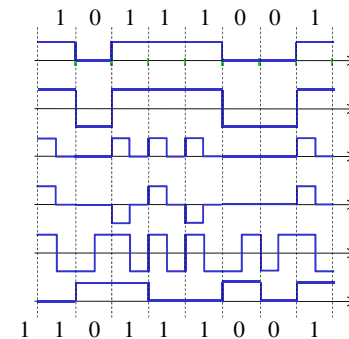
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Digital Mod 16

See Young p 488  
Bengt Wedelin p 97

## Baseband modulation or Channel coding

1 = "mark"  
0 = "hole"



NRZ – Non Return to Zero

Bipolar

RZ – Return to Zero (50 % duty cycle)

AMI – Alternate Mark Inversion

Manchester code (Ethernet)  
(one transition in each bit interval)

Differential code

'Hi' = change, 'Low' = no changeThis is modulation in the wide sense of the word: to match the signal to the channel

### Important aspects:

- Avoid DC levels in the signal (problem for many channels)
- Synchronization (clock recovery) necessary (problem with many codes)

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Digital Mod 17

## Noise and Error probability

- Noise
- ISI
- Eye diagram
- Error probability

## Limiting factor: Noise and ISI

- Analog system: The noise is always accumulative!  
(The signal becomes worse and worse)
- Digital system: Use regenerators! Detect '1', '0' and resend.  
⇒ May have a perfect signal through a bad channel (many regenerators)!

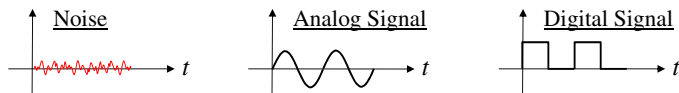
- Wired systems: Limiting factor is ISI - (Inter) Symbol Interference
- Radio systems: Thermal noise is the limiting factor.

BER (Bit Error Rate): The probability of error is given by the thermal noise and ISI

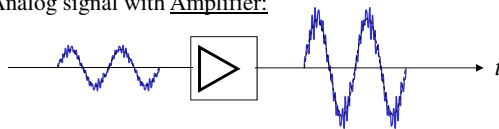
The total noise is often given as the sum of the thermal noise and the quantization noise. However, the quantization noise is introduced by the D/A and does **not** give any BER!!!

$$N_{tot} = N_q + N_{term}$$

## Amplifier - Regenerator



Analog signal with Amplifier:



The **noise** is accumulative!  
(- noise on input is amplified together with the signal, and the amplifier adds some additional noise. S/N is always lower afterwards.)

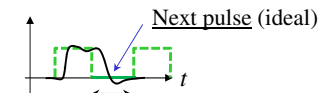
Digital signal with Regenerator:



Using a sufficient number of regenerators, a digital signal can be perfectly transmitted through a noisy channel!

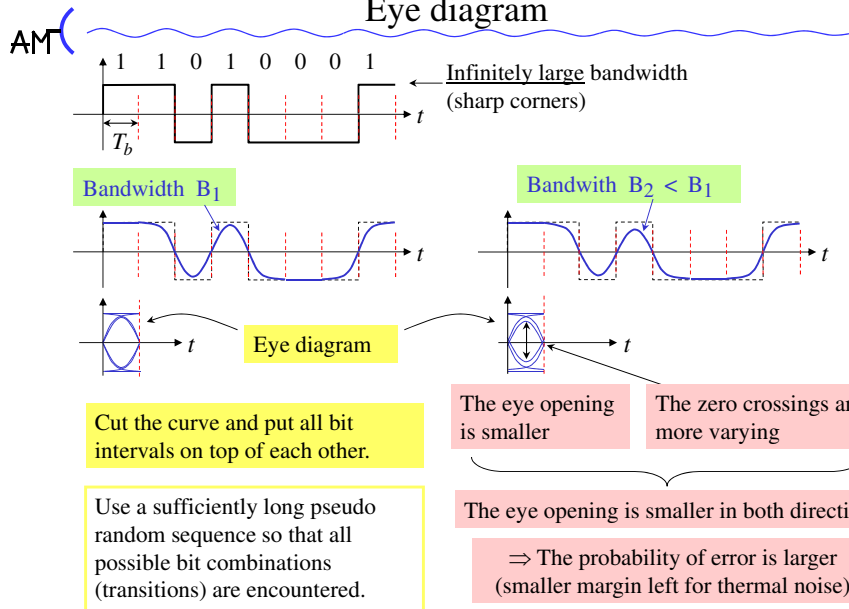
## ISI – Inter Symbol Interference

Limited bandwidth and/or Transmissions channel distortion give ISI:



The pulse has a "stretching delay" that interferes with the next pulse.

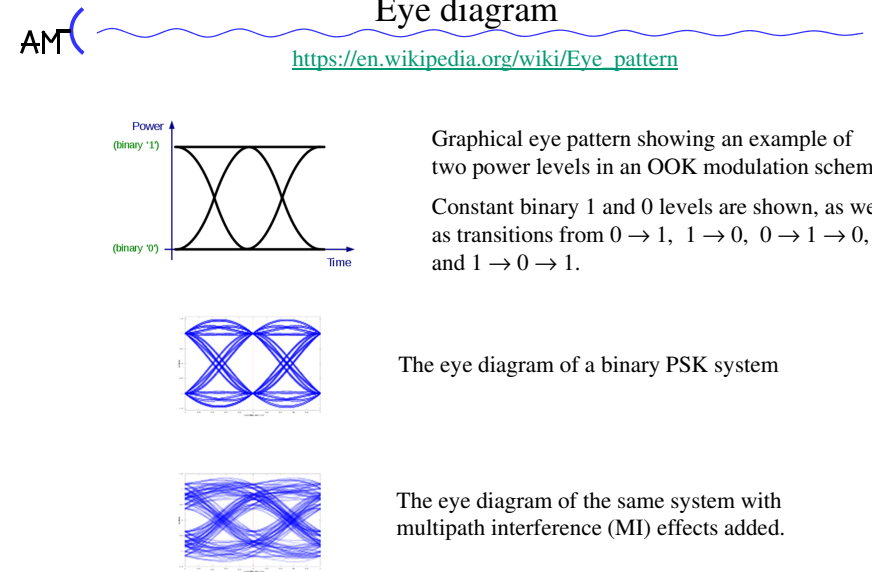
The pulses are "floating" into each other.



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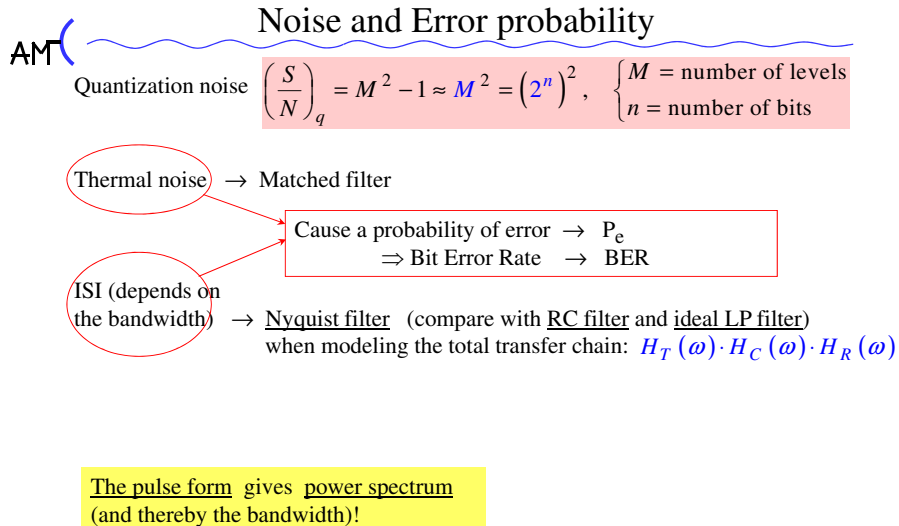
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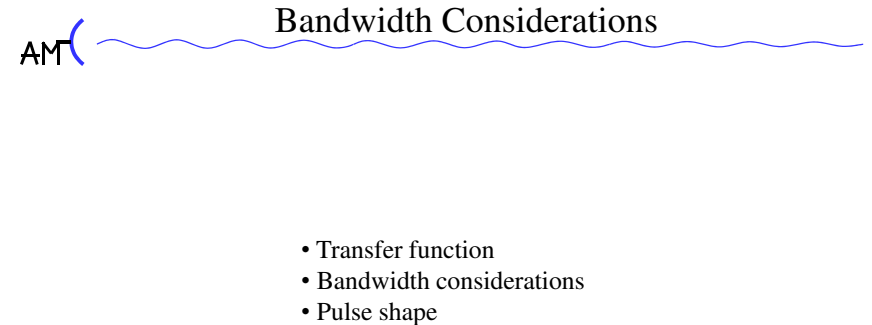
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Digital Mod 24



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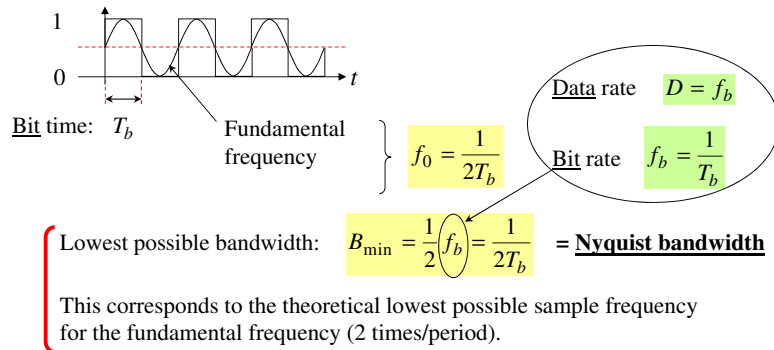
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## Nyquist bandwidth (minimum bandwidth)

If we had always changing 1's and 0's  
 $\Rightarrow$  sufficient to transmit the fundamental frequency only.



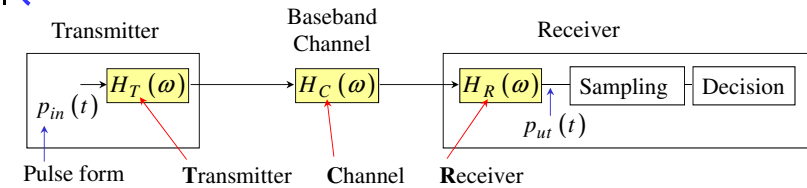
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## Modeling of the transfer chain



$$P_{ut}(\omega) = P_{in}(\omega) \cdot \underbrace{H_T(\omega) \cdot H_C(\omega) \cdot H_R(\omega)}_{H(\omega)}$$

The square pulses (on input) are band limited through the "filters"  $H_T \cdot H_C \cdot H_R$  and thus "smudged out" so they interfere with each other  $\Rightarrow$  ISI. (See the eye diagram).

What is the "best" transfer function?  $H(\omega) = H_T(\omega) \cdot H_C(\omega) \cdot H_R(\omega)$

Compromise between good detection and small bandwidth.

Harry Nyquist suggested a cosine roll-off filter as a good compromise. See next slide.

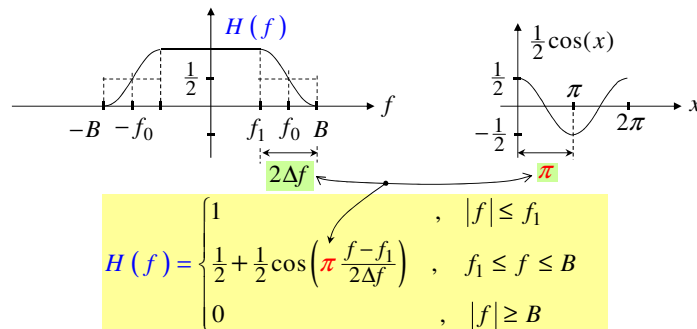
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## Nyquist filter, (Cosine shaped filter)



Roll-off factor:  $r = \frac{\Delta f}{f_0}$ ,  $0 \leq r \leq 1$  Total bandwidth:  $B = f_0 + \Delta f = f_0(1+r)$

Impulse response:  $r \cdot f_0 = \Delta f$

$$h(t) = 2f_0 \cdot \frac{\sin(2\pi f_0 t)}{2\pi f_0 t} \cdot \frac{\cos(2\pi r f_0 t)}{1 - (4r f_0 t)^2}$$

$$h(t) = \frac{\omega_0}{\pi} \cdot \frac{\sin(\omega_0 t)}{\omega_0 t} \cdot \frac{\cos(r \omega_0 t)}{1 - \left(2r \frac{\omega_0}{\pi} t\right)^2}$$

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## Nyquist filter, Bandwidth

The bandwidth corresponds to the data rate:

$$f_0 = \frac{1}{2} f_b = \frac{1}{2} D = \frac{1}{2T_b}$$

$$B = f_0(1+r) = f_b \frac{1+r}{2} = D \frac{1+r}{2}$$

$r = 0$  gives an ideal LP filter.

$$r = 0 \quad B = f_0(1+r) = f_0 = \frac{1}{2T_b} = 0.5 f_b$$

Theoretical minimum.  
Not achievable!

$$r = 0.5 \quad B = 1.5 f_0 = 1.5 \frac{1}{2T_b} = 0.75 f_b$$

Pretty good!

(Now also  $r < 0.5$  is being used!)

$$r = 1 \quad B = 2 f_0 = \frac{1}{T_b} = f_b$$

"Luxury!"

PCM signal with 64 kbps:  $(r = 0 \quad B = 32 \text{ kHz})$

$r = 0.5 \quad B = 48 \text{ kHz}$

$(r = 1 \quad B = 64 \text{ kHz})$

PCM – demands larger bandwidth than e.g. PAM, but is not so sensitive to noise. (Compare with FM where robustness to noise also was paid for by bandwidth.)

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Digital Mod 29

## Pulse shape and Bandwidth

AM

The Nyquist bandwidth (or the Nyquist filter) gives a good indication of the necessary bandwidth to transmit a certain bitrate of data.

However, the signal (or pulse) bandwidth is also very important.

A square pulse has the sinc-function as Fourier transform, and thus the squared sinc-function as power spectral density (PSD).

This power spectrum is much wider than the Nyquist filter, and thus a lot of power will be lost (filtered away in the channel) and will not reach the receiver.

Therefore we want the binary pulse to have a shape so that most of the power actually comes through the channel and can be received (to maximize the SNR).

Hint for the RF bandwidth:

Multiplication in time domain corresponds to convolution in frequency domain.

(Base-band pulse bandwidth times a factor 2. Compare upper and lower side-band.)

**Extra:** Use MATLAB (fft) to calculate the PSD for some simple pulse shapes, e.g. a rectangular pulse, raised-cosine or cosine squared pulse.

Also, use MATLAB (fft) to calculate the impulse response for some filter shapes, e.g. Nyquist filter with different roll-off factors.  
(Check you result using  $r = 0$  which corresponds to an ideal LP filter.)

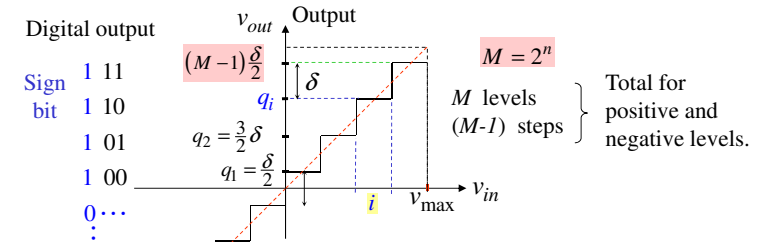
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## [Extra] The quantized signal's average power



$p_i$  is the probability that  $v_{in}(t)$  is within the interval  $i$  so that the output signal is  $q_i$

The quantized signals average power:  $S_q = \frac{1}{R} \sum_{i=1}^M p_i \cdot q_i^2$

Assume all signal levels equally probable:  $p_i = \frac{1}{M}$

$$S_q = \frac{1}{R} 2 \frac{1}{M} \left[ \left(\frac{\delta}{2}\right)^2 + \left(\frac{3}{2}\delta\right)^2 + \dots + \left((M-1)\frac{\delta}{2}\right)^2 \right] = \frac{1}{R} 2 \frac{1}{M} \left(\frac{\delta}{2}\right)^2 [1^2 + 3^2 + 5^2 + \dots + (M-1)^2]$$

$$= \frac{1}{R} 2 \frac{1}{M} \left(\frac{\delta}{2}\right)^2 \left[ \frac{M(M-1)(M+1)}{6} \right] = \frac{1}{R} 2 \left(\frac{\delta}{2}\right)^2 \cdot \frac{M^2-1}{6} = \frac{1}{R} \delta^2 \cdot \frac{M^2-1}{12}$$

positive and negative (sign bit)

The sum of the series can be shown by "induction".

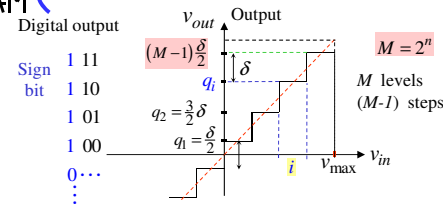
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## [Extra] Quantization noise: $v(t) - v_q(t)$



- $p(x)$  is the probability density function for the signal amplitude.
- The average quantization noise power for the interval  $i$  becomes:

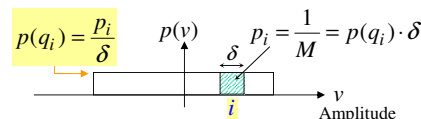
$$N_{qi} = \frac{1}{R} \int_{q_i - \delta/2}^{q_i + \delta/2} (x - q_i)^2 p(x) dx$$

- If  $\delta$  is small, the probability can be treated as constant over the small interval:

- Substitute:  $y = x - q_i$ ,  $dy = dx$   $p(x) \approx p(q_i) = \text{constant}$

$$N_{qi} = \frac{1}{R} p(q_i) \int_{-\delta/2}^{\delta/2} y^2 dy = \frac{1}{R} p(q_i) \left[ \frac{1}{3} y^3 \right]_{-\delta/2}^{\delta/2} = \frac{1}{R} p(q_i) \frac{\delta^3}{12}$$

Assume that all levels are equally probable - Uniform probability density function:



$$\sum_{i=1}^M p_i = 1 \quad \left\{ \begin{array}{l} \text{The sum of all} \\ \text{probabilities} \\ \text{has to be unity.} \end{array} \right.$$

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## [Extra] Signal to quantization noise ratio

We had the uniform probability density function  $p(q_i) = \frac{p_i}{\delta}$

and that the average power for the quantization noise for the interval  $i$  was:

$$N_{qi} = \frac{1}{R} p(q_i) \frac{\delta^3}{12} \quad \text{Thus, the total power for the quantization noise becomes:}$$

$$N_q = \sum_i N_{qi} = \frac{1}{R} \sum_i \frac{p_i}{\delta} \frac{\delta^3}{12} = \frac{1}{R} \frac{\delta^2}{12} \sum_i p_i = \frac{1}{R} \frac{\delta^2}{12}$$

Average signal power:

$$\text{Signal to quantization noise ratio: } \frac{S_q}{N_q} = \left( \frac{S}{N} \right)_q = \frac{\frac{1}{R} \delta^2 \cdot \frac{M^2-1}{12}}{\frac{1}{R} \frac{\delta^2}{12}} = \frac{M^2-1}{1} \approx M^2$$

Some authors use the maximum signal power (for a sinusoidal signal) to get:  $\left( \frac{S}{N} \right)_q \approx \frac{3}{2} M^2$

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