

CSE 311:

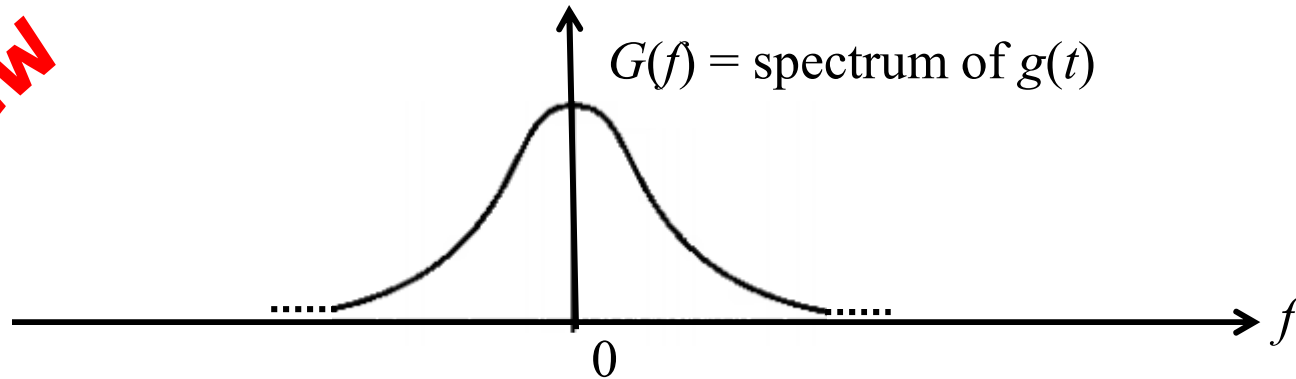
Data Communication

Instructor:
Dr. Md. Monirul Islam

Sampling and Analog-to-Digital Conversion

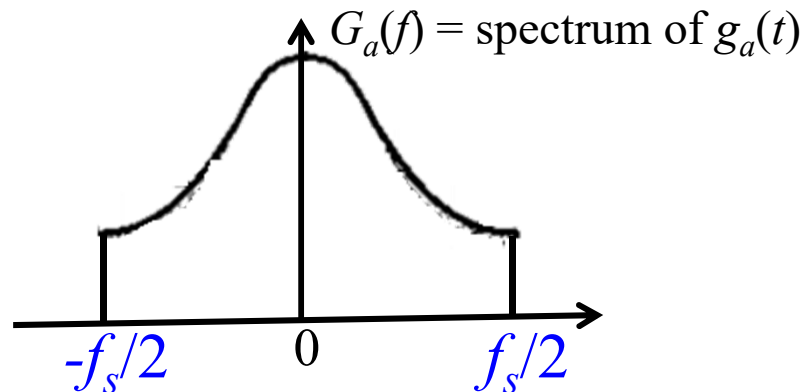
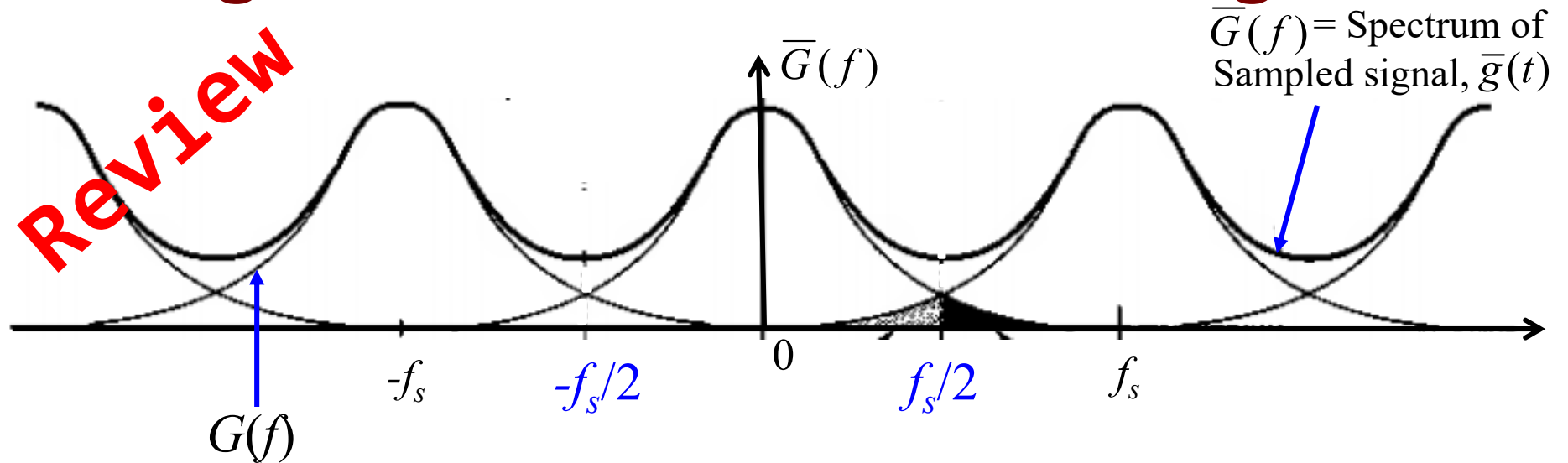
Sampling Effect: Non-band-limited signal to band-limited signal

Review



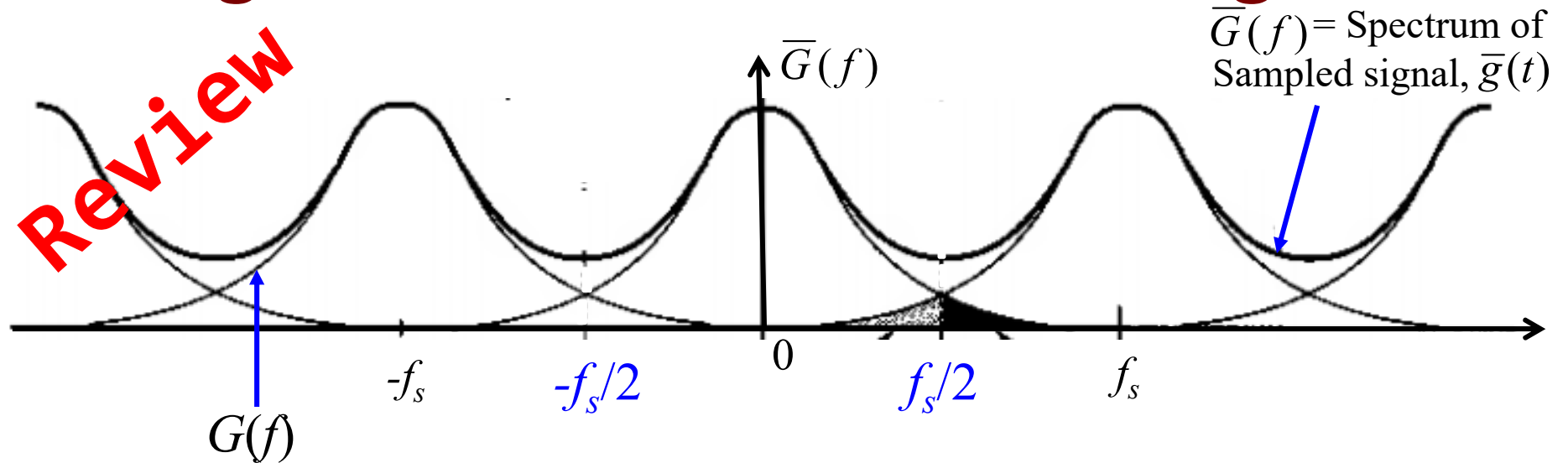
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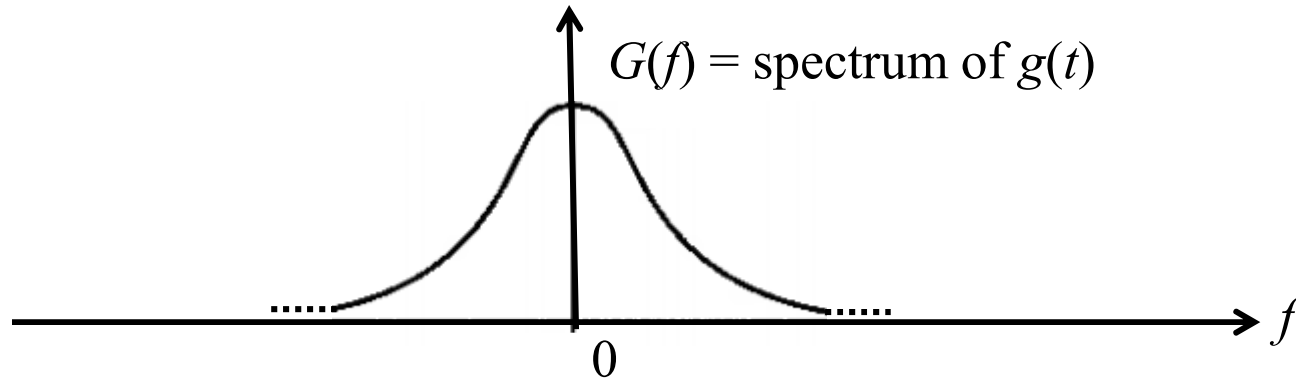
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Review



✓ Sampling a non-band-limited signal $g(t)$ at f_s is equivalent to Nyquist sampling of some signal $g_a(t)$ band-limited to $f_s/2$

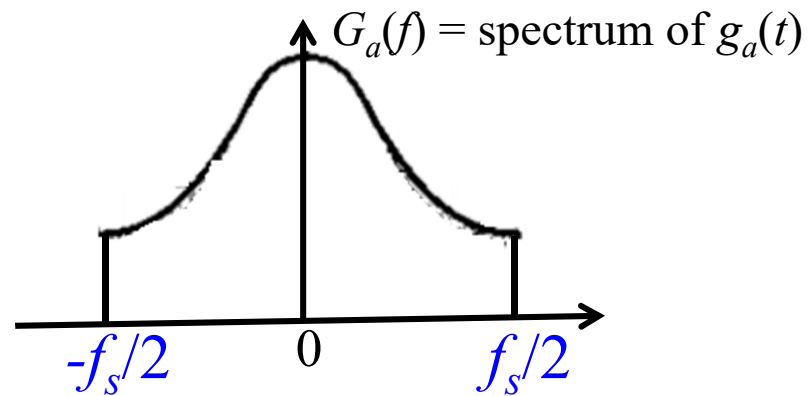
Sampling Effect: Non-band-limited signal to band-limited signal



Let

sub-Nyquist Sampling of $g(t)$ at f_s generates samples $g(0), g(T_s), g(2T_s), g(3T_s), \dots$

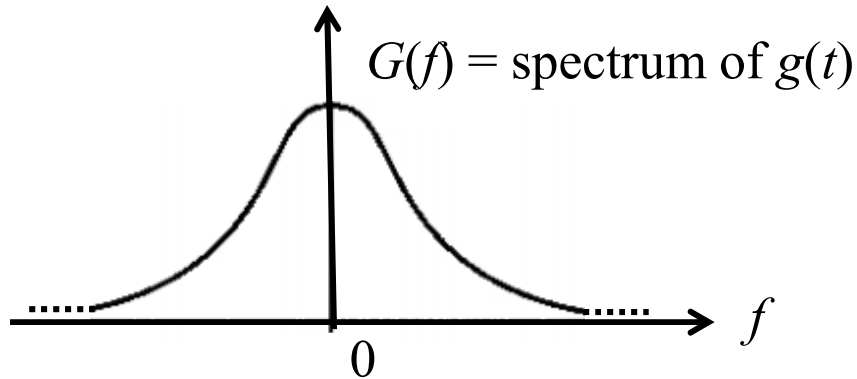
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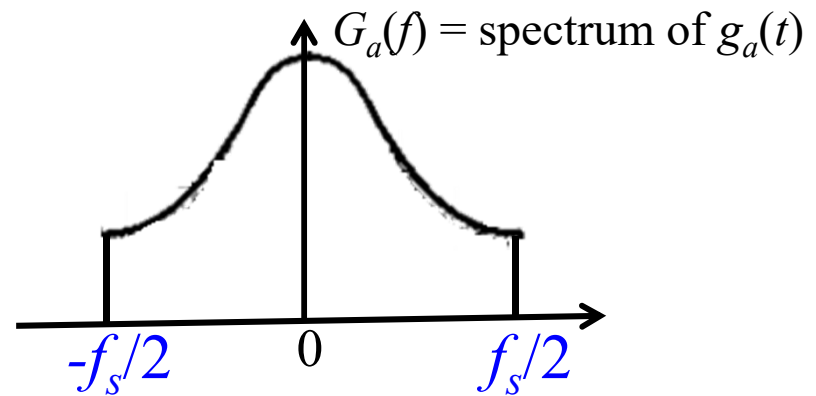
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Nyquist Sampling of $g_a(t)$ at f_s generates samples $g_a(0), g_a(T_s), g_a(2T_s), g_a(3T_s), \dots$

Sampling Effect: Non-band-limited signal to band-limited signal

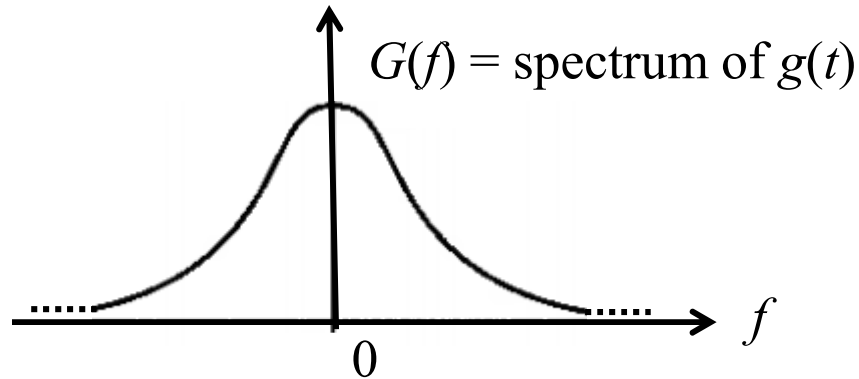


sub-Nyquist Samples $g(0)$,
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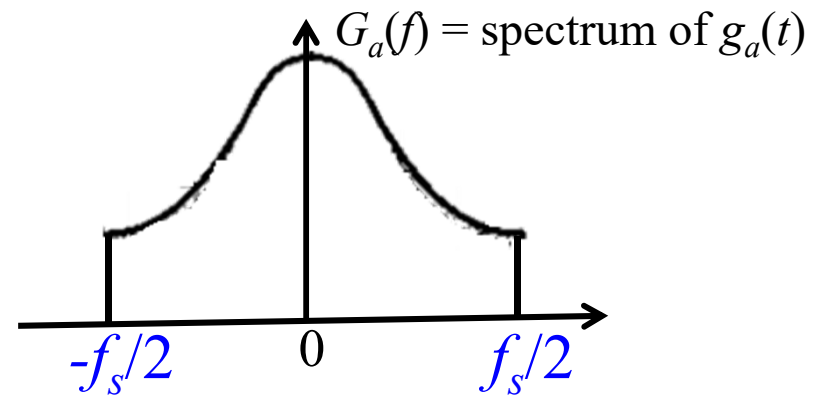


Nyquist Samples $g_a(0)$, $g_a(T_s)$, $g_a(2T_s)$,
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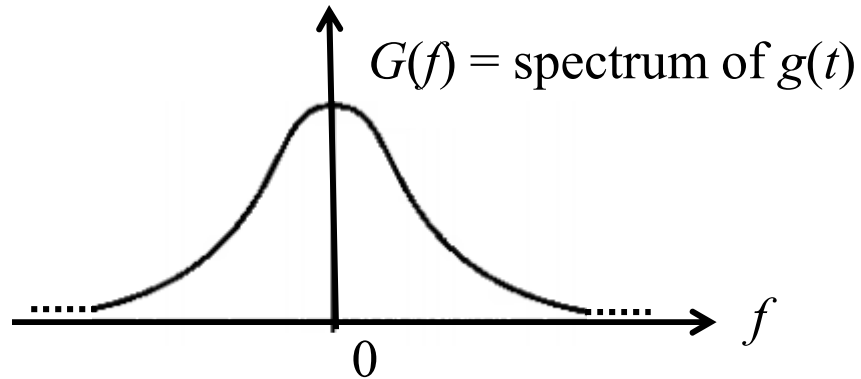


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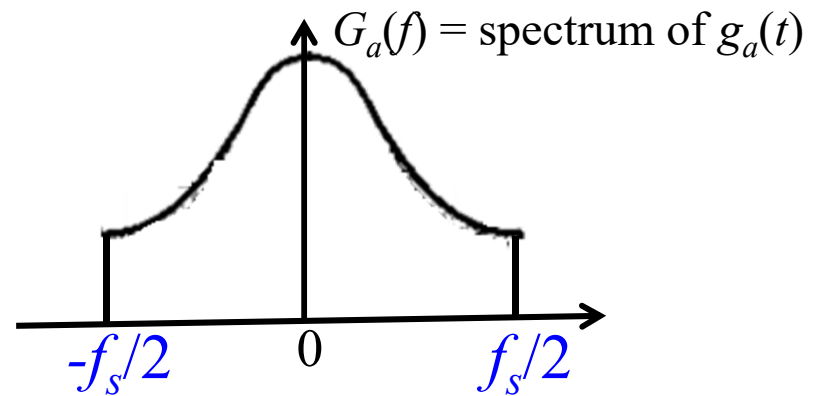
According to sampling effect that we saw,

$$g(0) = g_a(0), g(T_s) = g_a(T_s), g(2T_s) = g_a(2T_s), g(3T_s) = g_a(3T_s), \text{ and so on}$$

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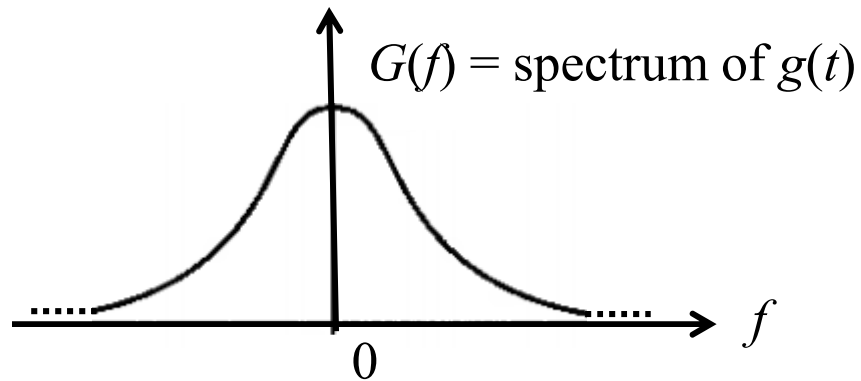


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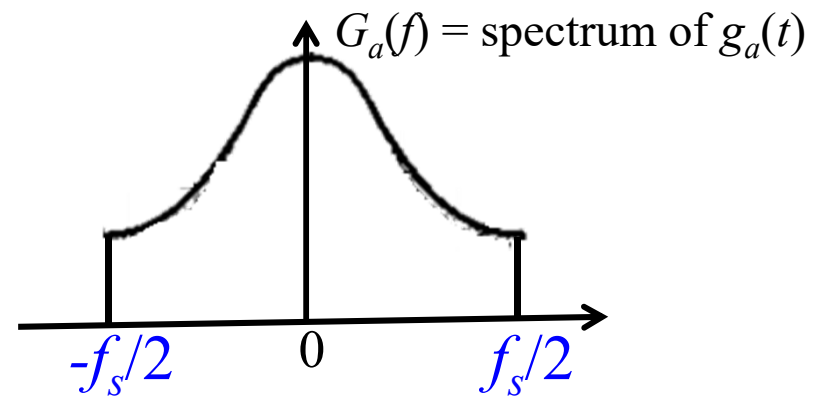
Therefore,

$$g(nT_s) = g_a(nT_s) = g_n$$

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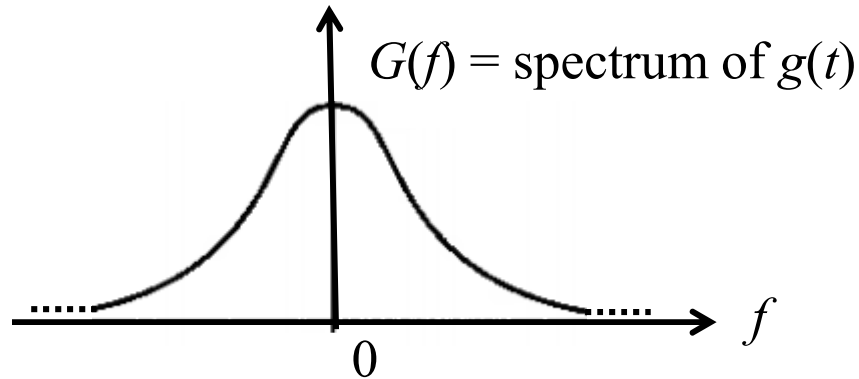
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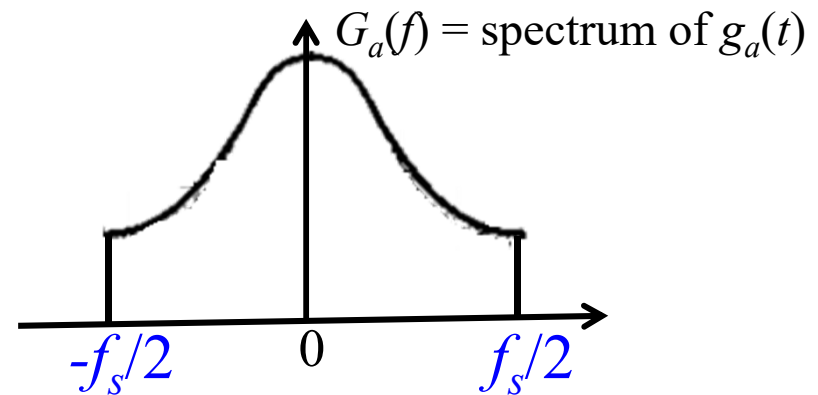
$$g(nT_s) = g_a(nT_s) = g_n$$

In other words, sampling $g(t)$ and $g_a(t)$ at the rate of $f_s = 1/T_s$ will generate the **same data sequence**, g_n

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This means, data sequence g_n can generate $g_a(t)$ by interpolation

Maximum Information Rate of a Channel with BW = B Hz

Assume

- Error free, noise less channel
- Channel bandwidth is B

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We will prove

- Maximum $2B$ pieces of information can be sent per second

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Previous Knowledge

- Channel can send a low pass signal of B Hz
- This signal can be recovered from samples uniformly taken at $2B$ samples per second

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We have to prove that

- A sequence of data at the rate of $2B$ Hz can come from uniform sampling of a signal of bandwidth B Hz
- The signal can be recovered from this data sequence

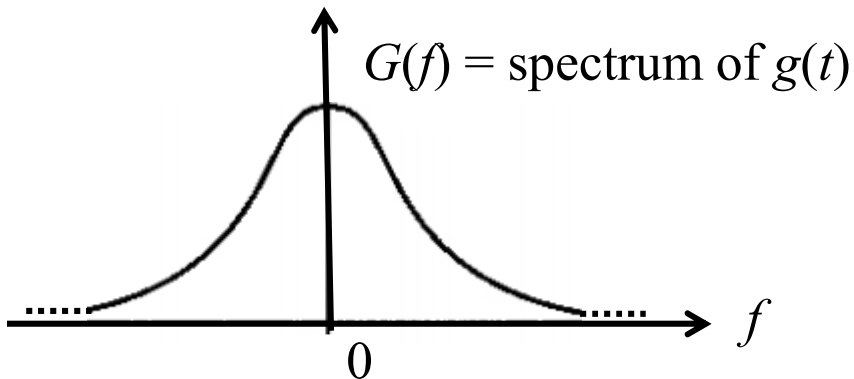
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Assume a sequence of samples $g_0, g_1, g_2, g_3, \dots$ denoted as $\{g_n\}$ at the rate of $2B$ s/s

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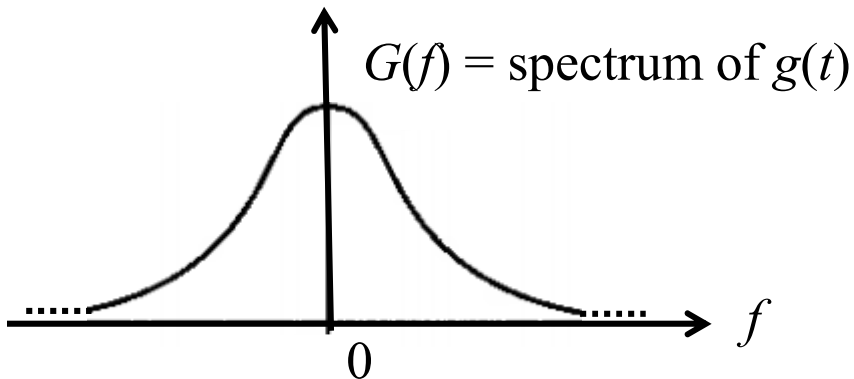
We will always find a signal $g(t)$ whose samples $g(0), g(T_s), g(2T_s), g(3T_s), \dots$ matches with $\{g_n\}$.



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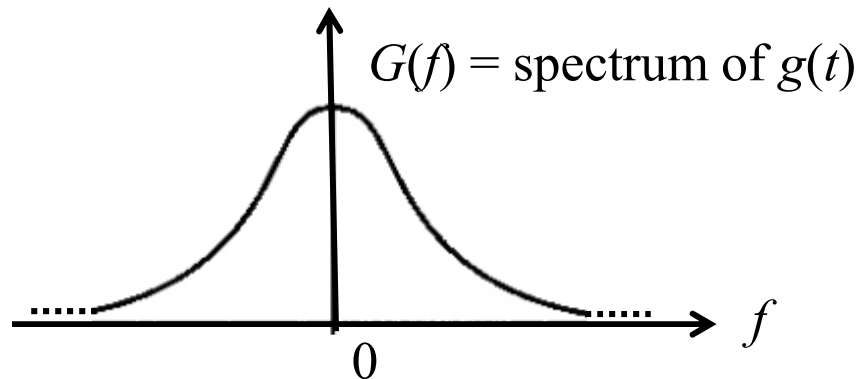
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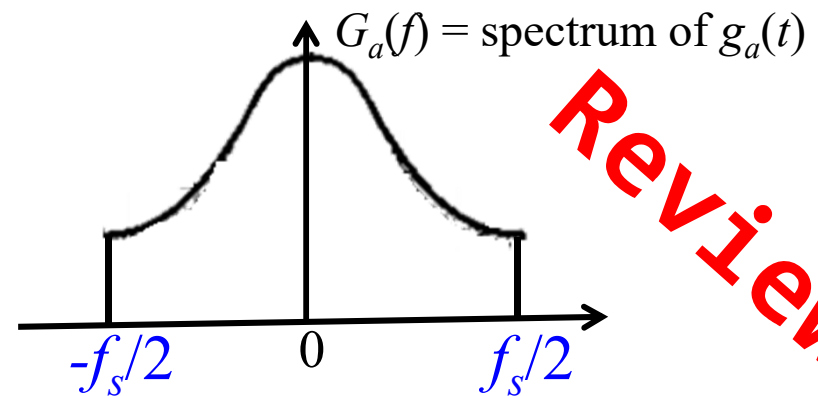


This means,
 $g_n = g(nT_s)$

Sampling Effect: Non-band-limited signal to band-limited signal



sub-Nyquist Samples $g(0)$,
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Review

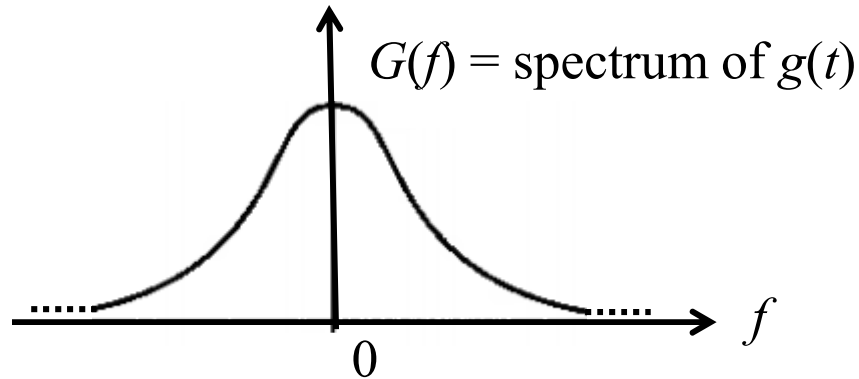
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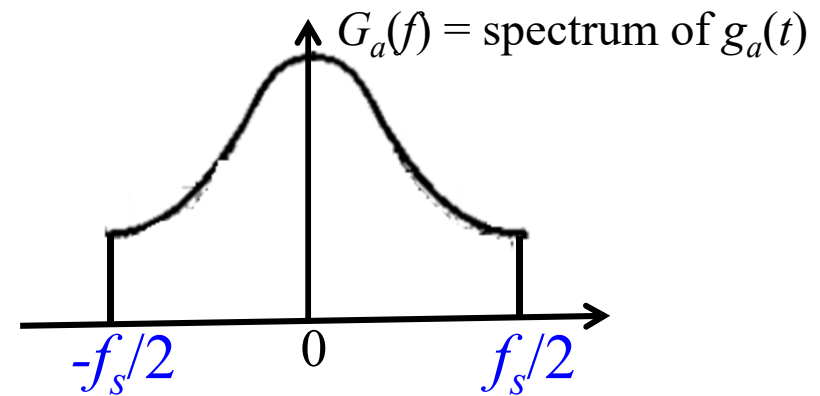
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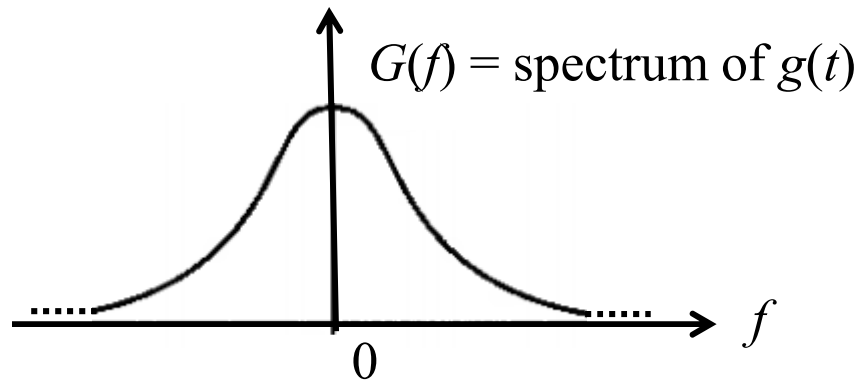


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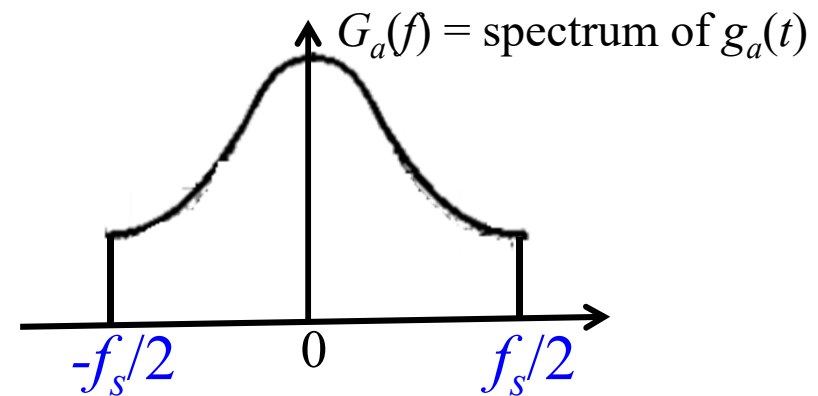


$$\bar{g}(t) = \sum_n g(nT_s) \delta(t - nT_s)$$

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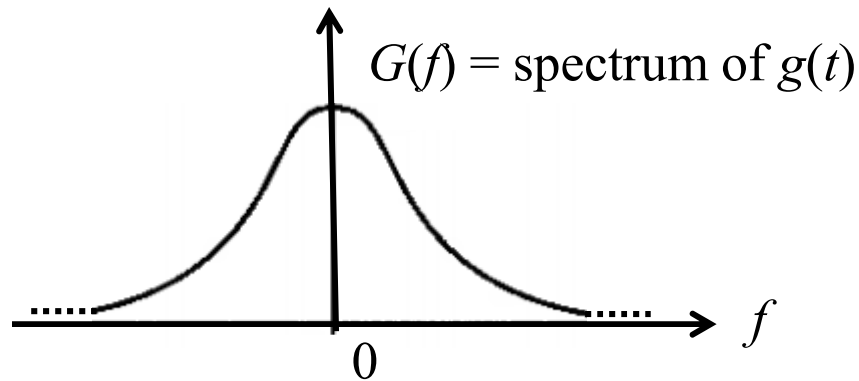
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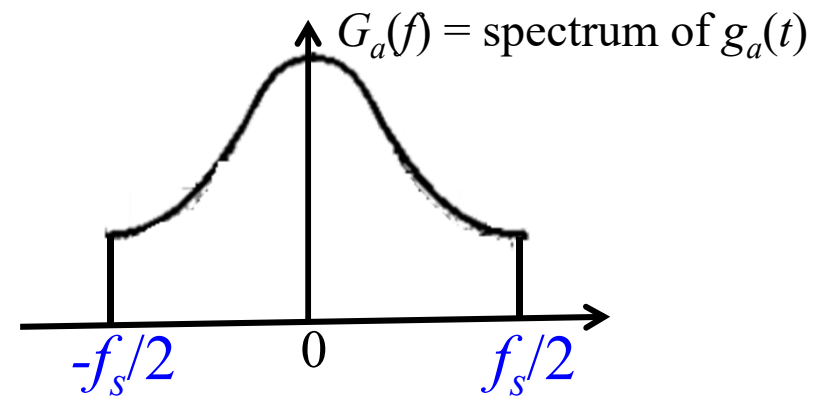
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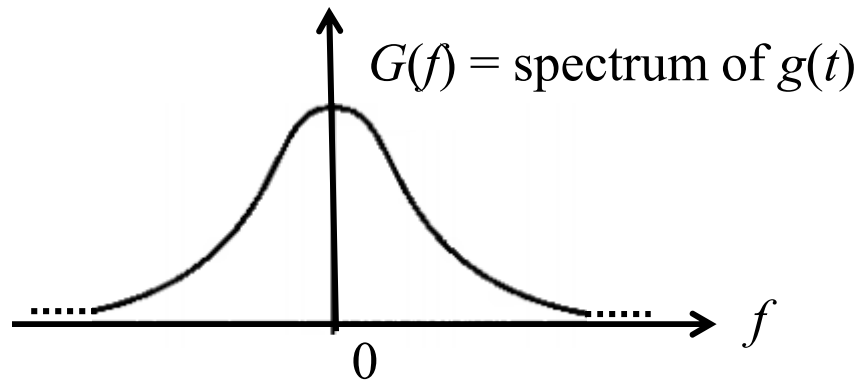


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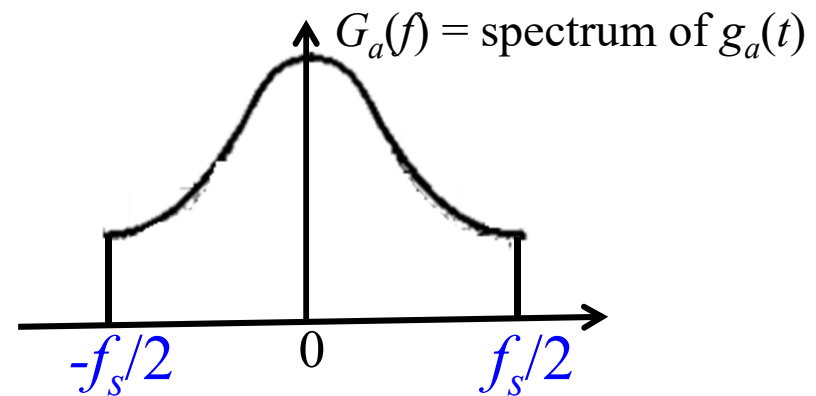


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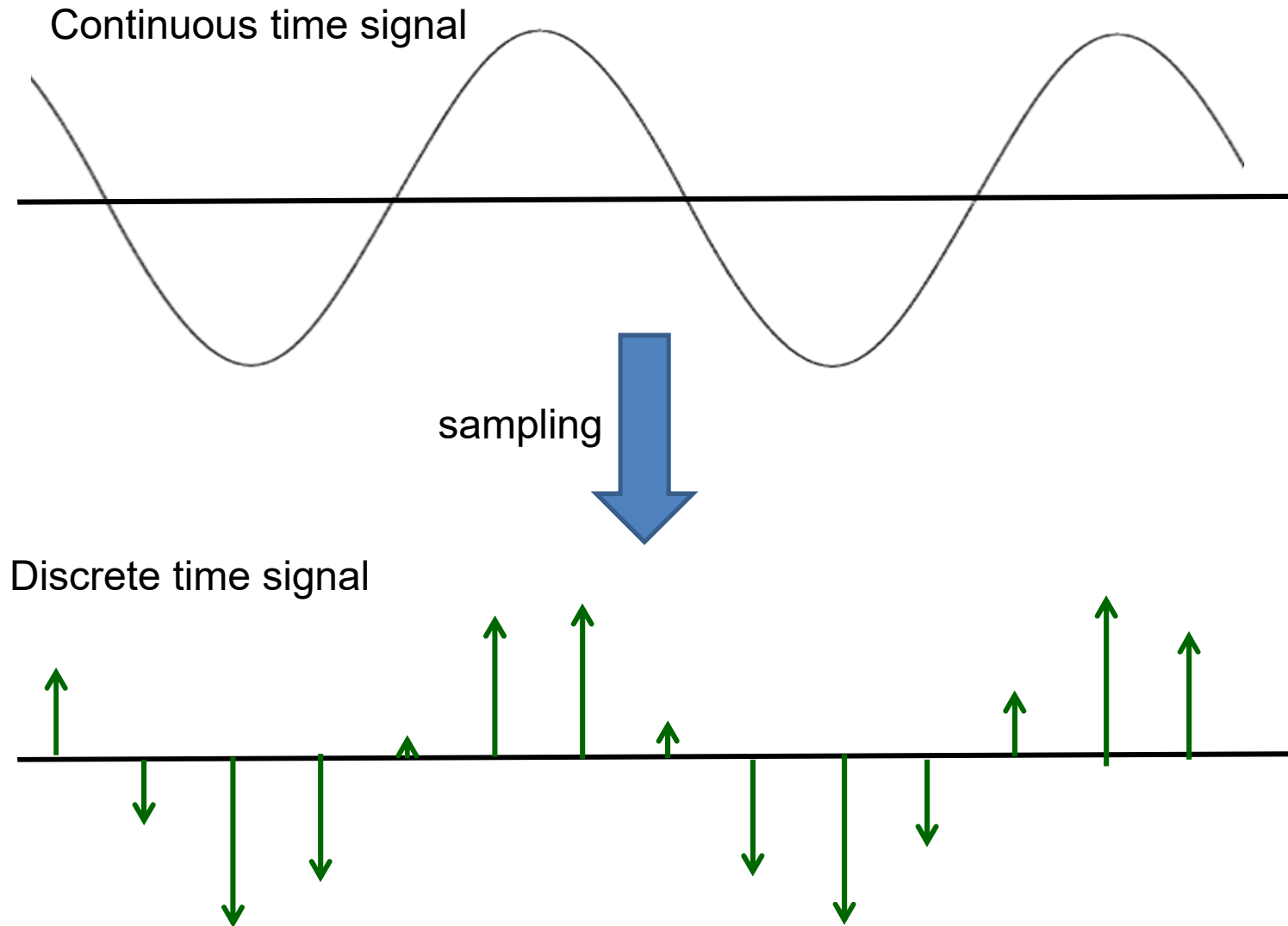
↓

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To recover $g_a(t)$, we can use $\{g_n\}$ using,

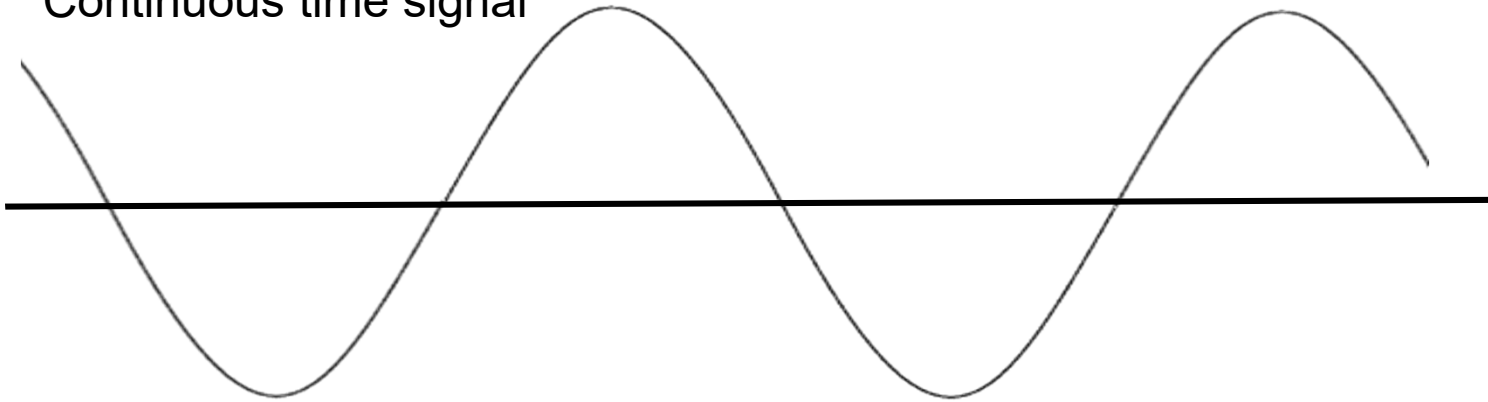
$$g_a(t) = \sum_n g_n \text{sinc}(2\pi Bt - n\pi)$$

Application of Sampling Theorem

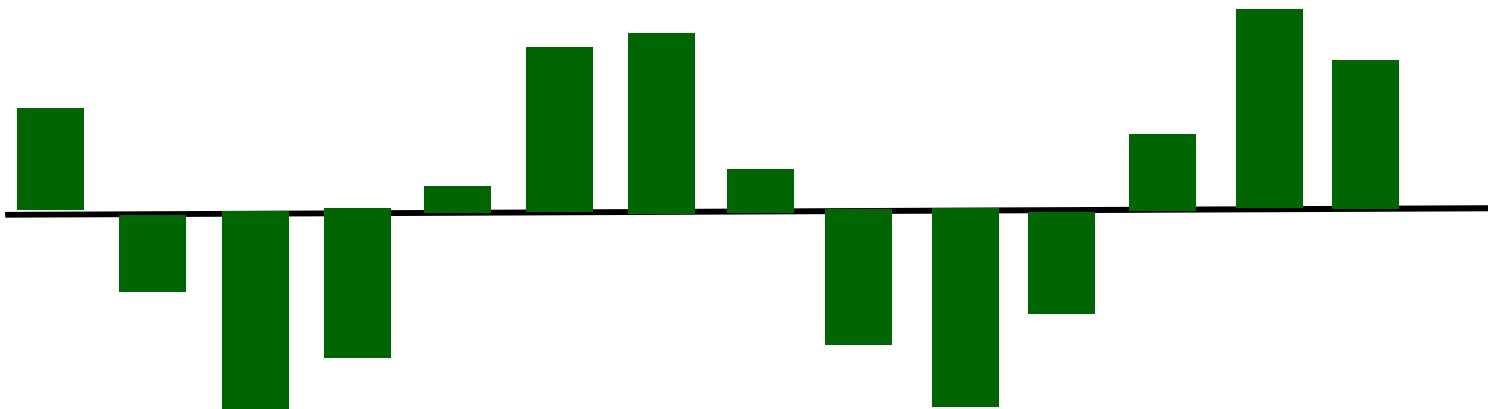


Application of Sampling Theorem

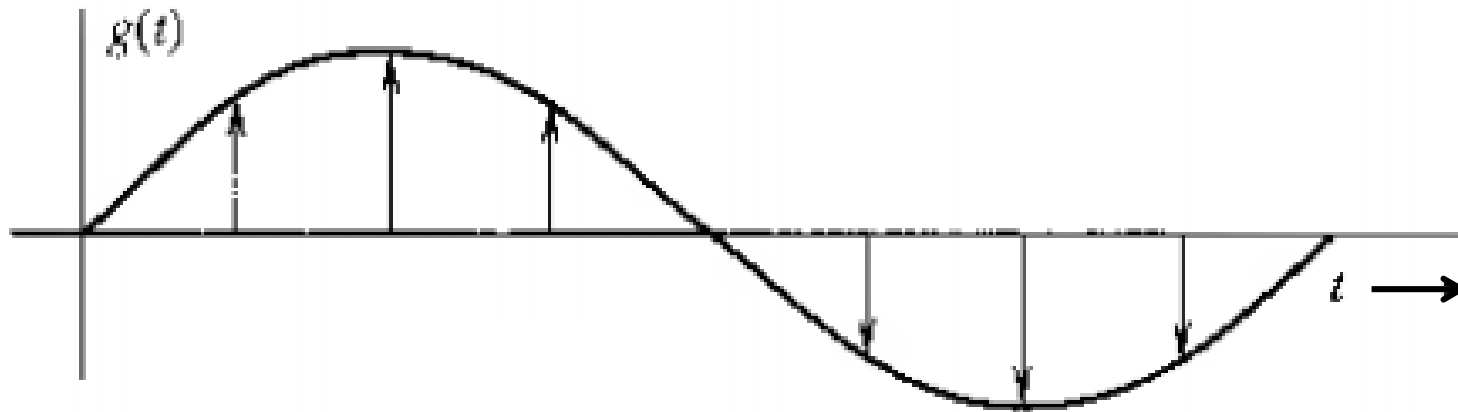
Continuous time signal



can be represented by pulse train and transmitted thereafter

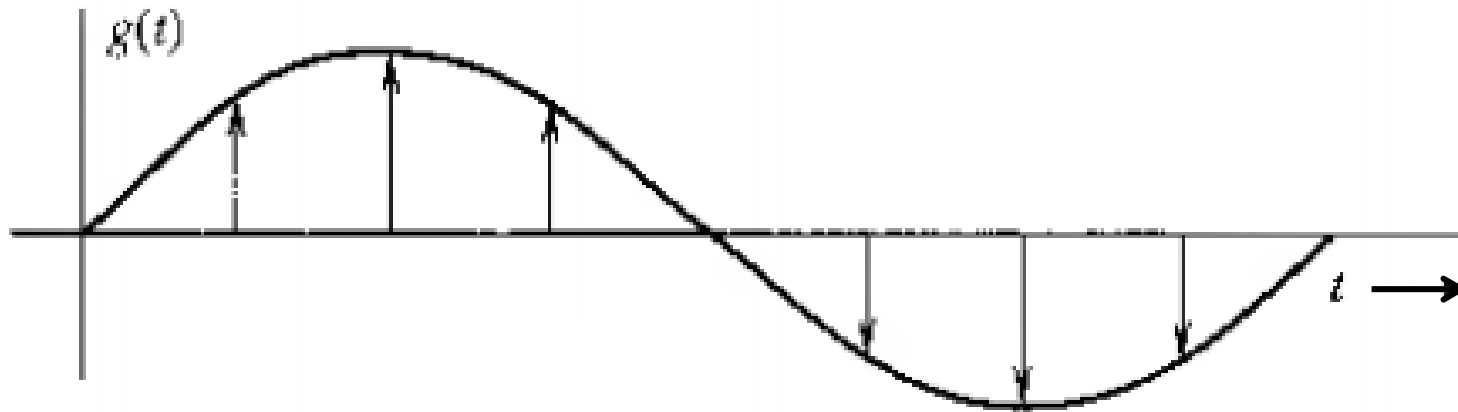


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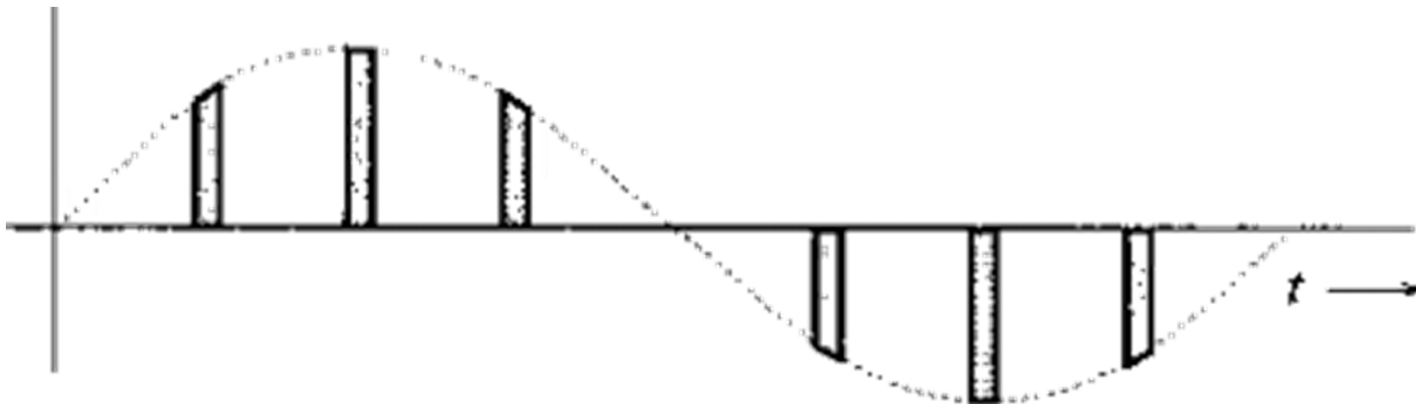


Pulse modulations: different ways to transmit sampled signal
modifying pulse trains

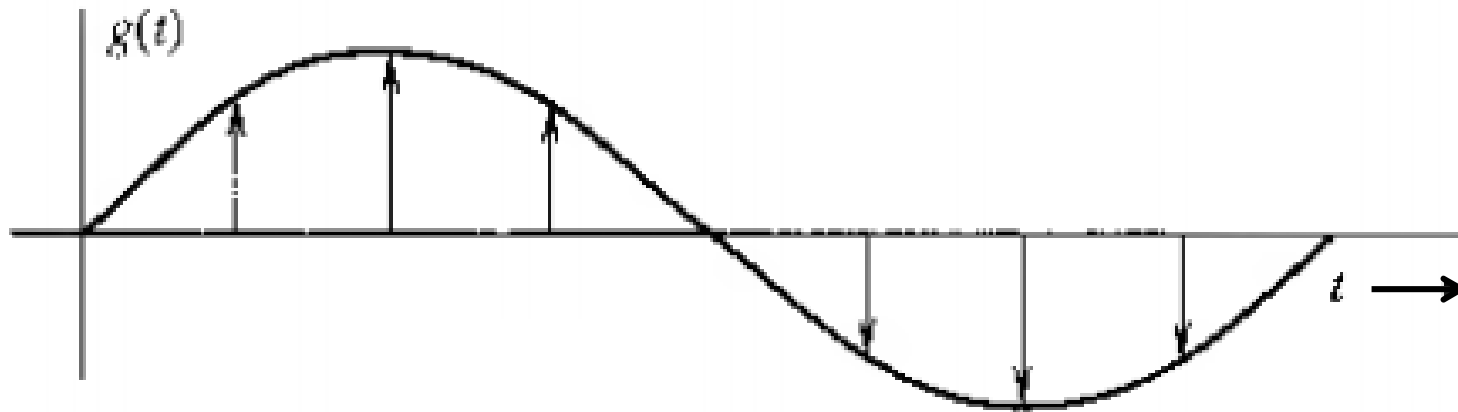
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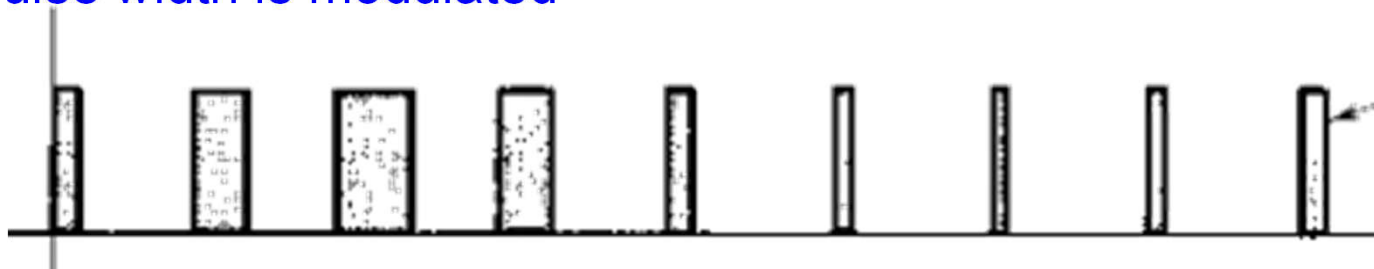
PAM: Pulse amplitude is modulated



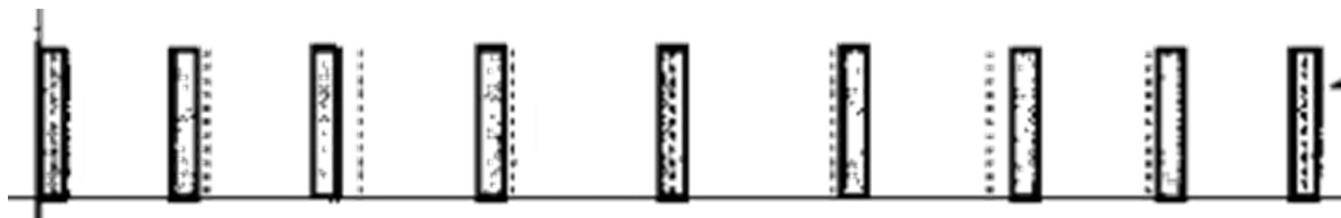
Application of Sampling Theorem



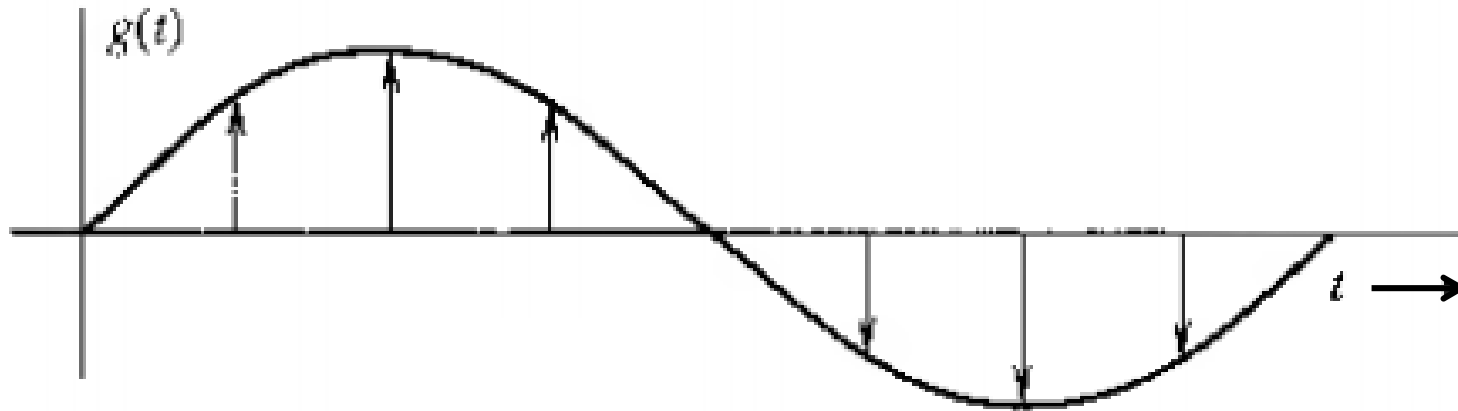
PWM: Pulse width is modulated



PPM: Pulse position is modulated



Application of Sampling Theorem

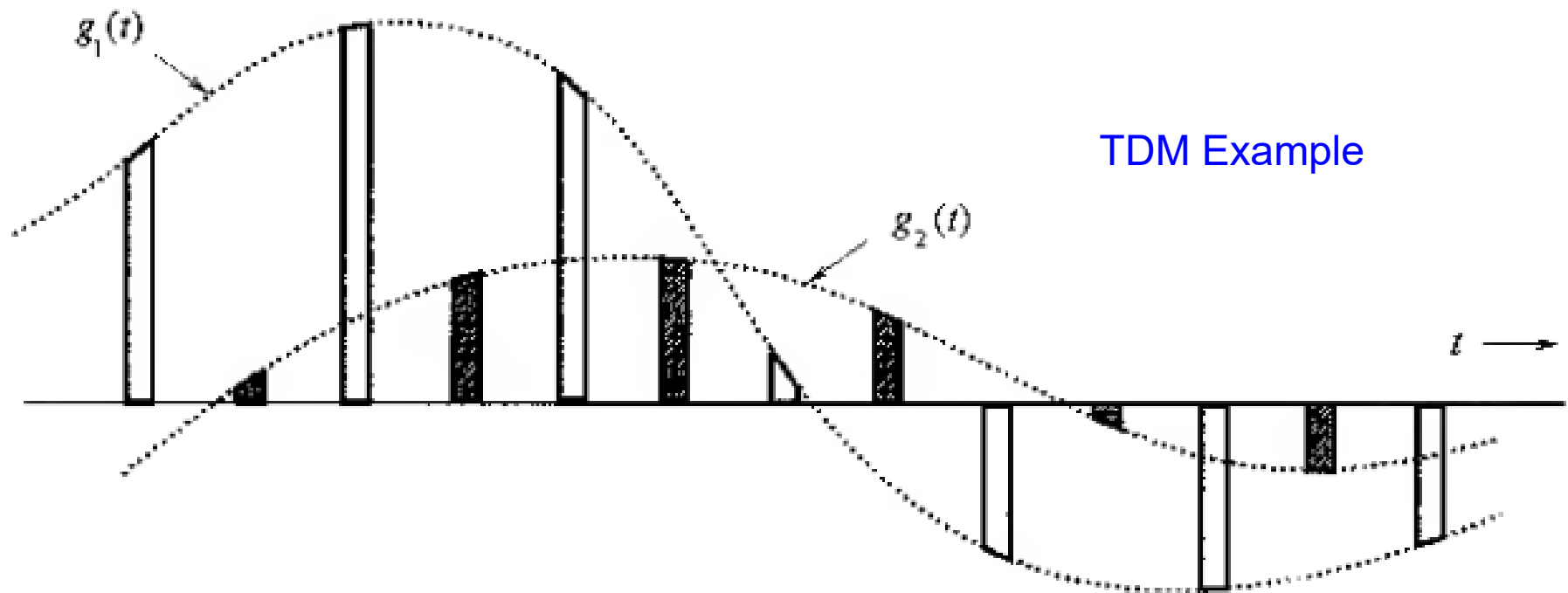


Pulse code modulation:

- most widely used pulse modulation
- each sample value is converted to a set of pulses.

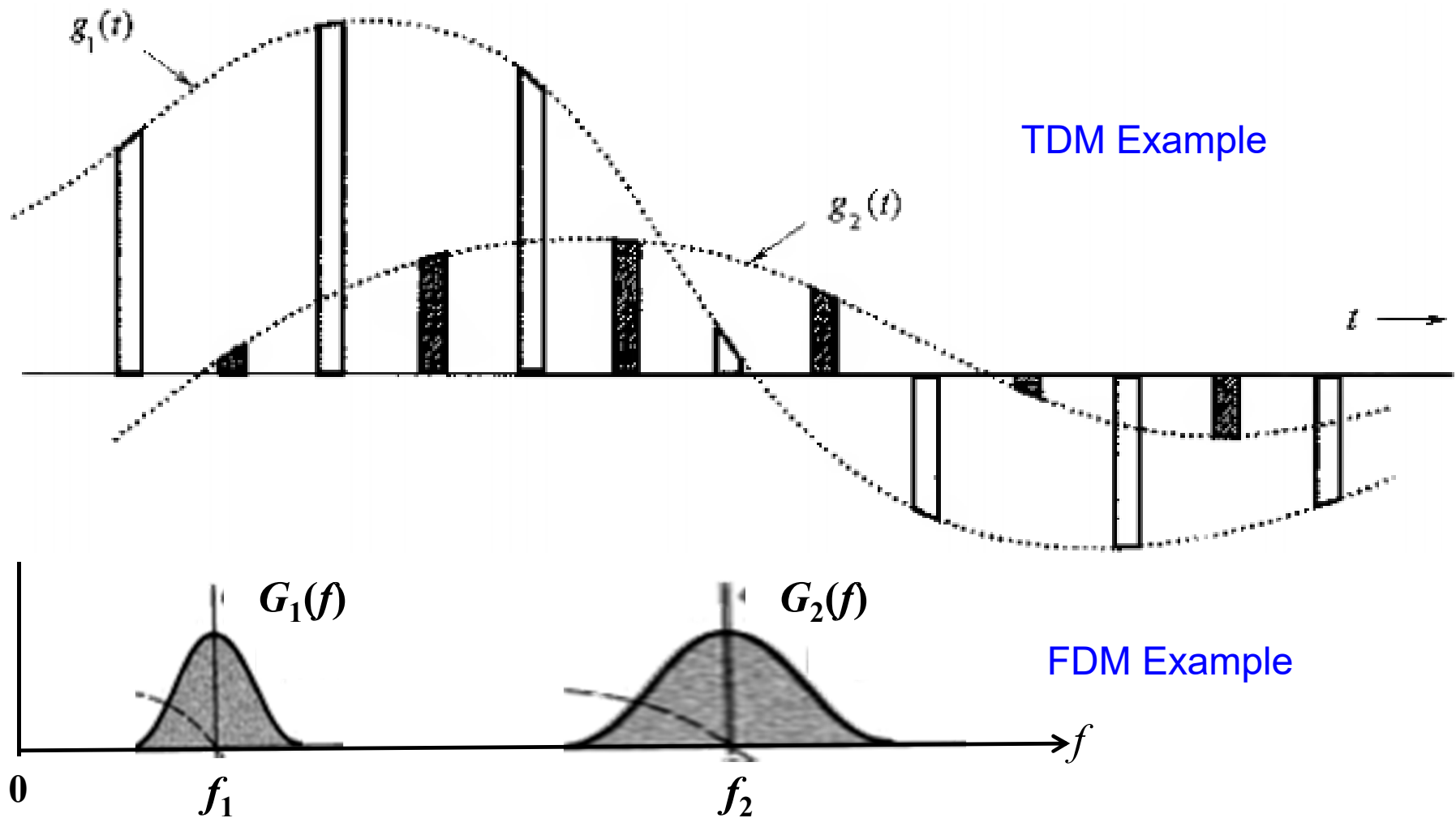
Application of Sampling Theorem

TDM: Pulses from multiple signals are interweaved on the same channel

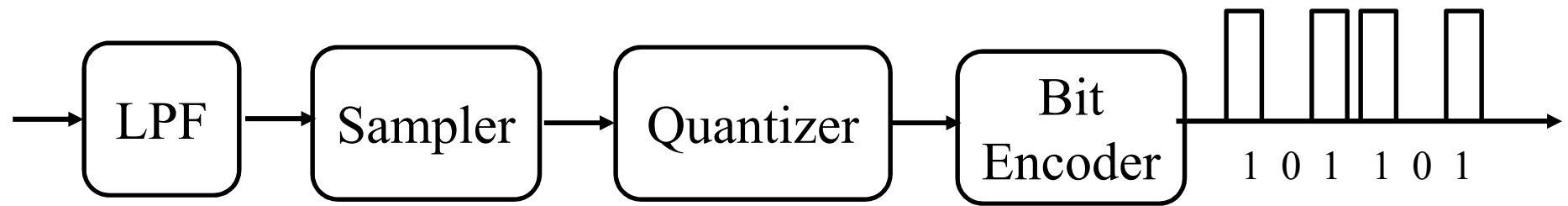


Application of Sampling Theorem

TDM: dual of FDM where different signals share channel bandwidth



Pulse Code Modulation (PCM)



PCM system: basically an ADC

Two major Steps:

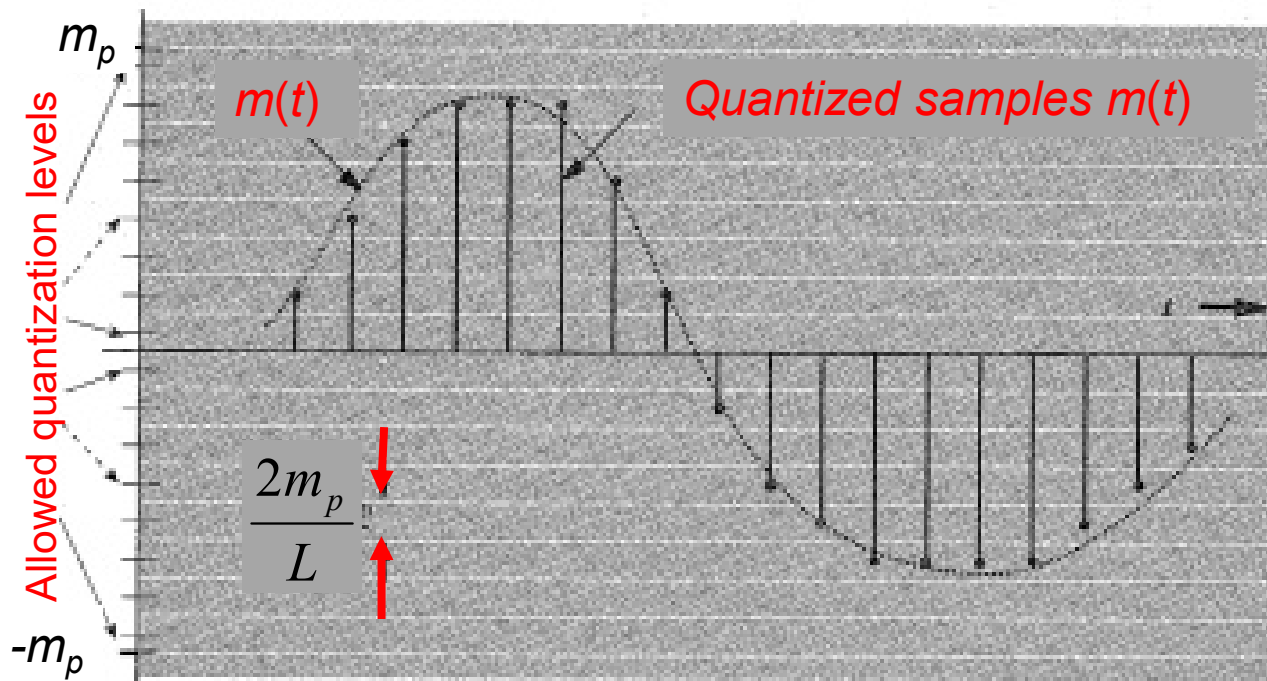
- Sampling and
- quantizing

Analog to Digital Conversion of Message Signal

- 2 major steps
 - Sampling
 - Quantizing

The range $(-m_p, m_p)$ is divided into L sub-intervals, each of magnitude Δv

$$\Delta v = \frac{2m_p}{L}$$



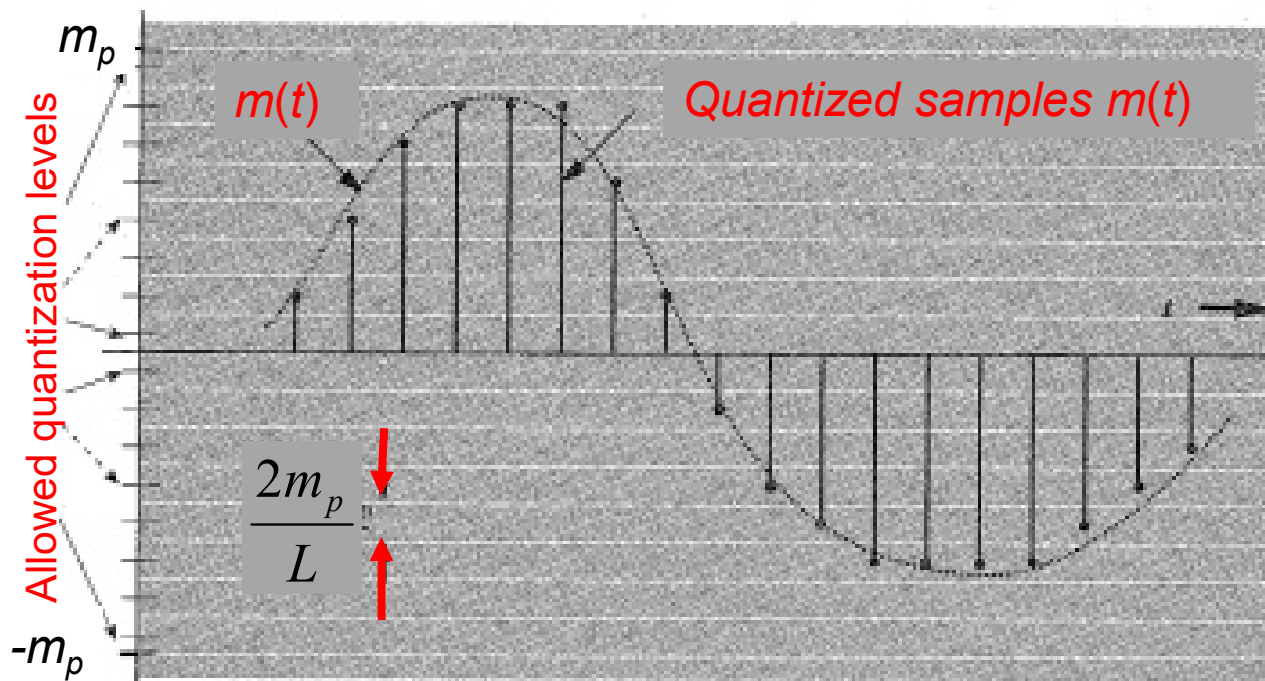
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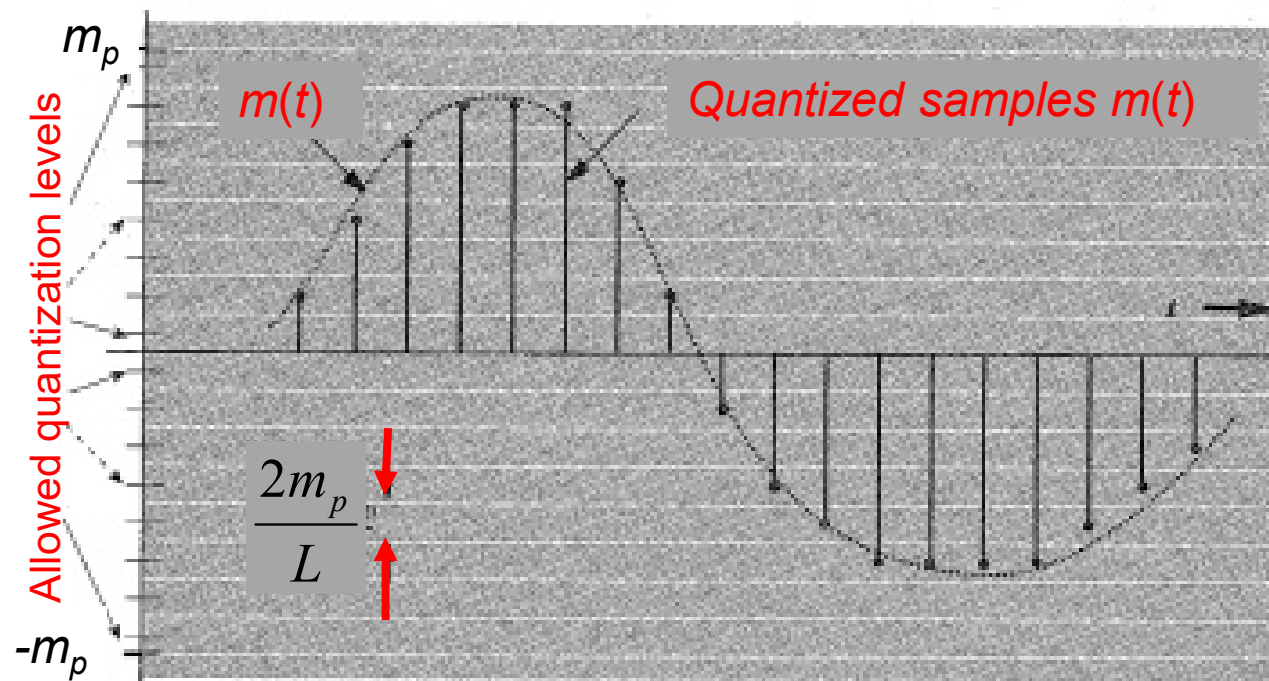
L is known as quantization level



Analog to Digital Conversion of Message Signal

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A **sampled value** is placed into one of these L sub-intervals, thus gets ONE of the L values

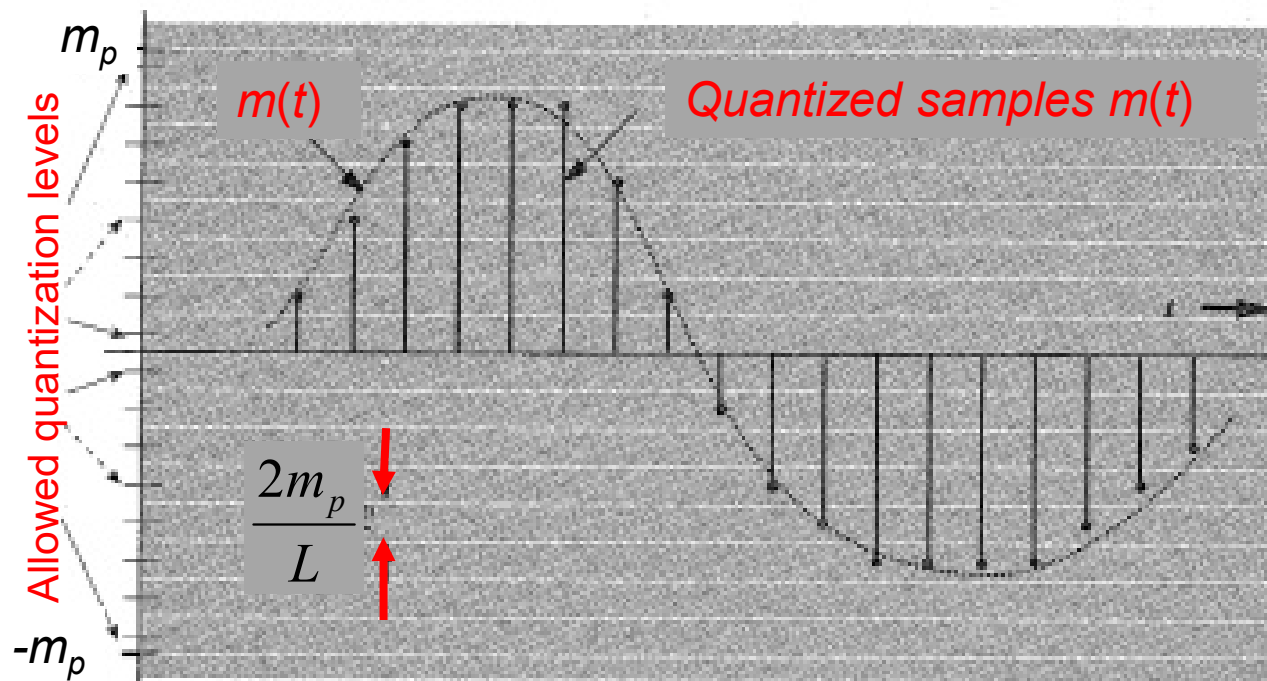


Analog to Digital Conversion of Message Signal

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Signal is known as L -ary digital signal



Analog to Digital Conversion of Message Signal

L -ary digital signal is converted to binary digital signal using pulse coding

Each of L values is encoded as a group of binary digits

| Digit | Binary equivalent |
|-------|-------------------|
| 0 | 0000 |
| 1 | 0001 |
| 2 | 0010 |
| 3 | 0011 |
| 4 | 0100 |
| 5 | 0101 |
| 6 | 0110 |
| 7 | 0111 |
| 8 | 1000 |
| 9 | 1001 |
| 10 | 1010 |
| 11 | 1011 |
| 12 | 1100 |
| 13 | 1101 |
| 14 | 1110 |
| 15 | 1111 |

Analog to Digital Conversion of Message Signal

L -ary digital signal is converted to binary digital signal using pulse coding

Each of L values is encoded as a group of binary digits

Each bit is transmitted using a distinct pulse shape

| Digit | Binary equivalent | Pulse code waveform |
|-------|-------------------|---------------------|
| 0 | 0000 | |
| 1 | 0001 | |
| 2 | 0010 | |
| 3 | 0011 | |
| 4 | 0100 | |
| 5 | 0101 | |
| 6 | 0110 | |
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Analog to Digital Conversion of Message Signal

Analog signal bandwidth to digital data rate

Audio signal b/w = 15 KHz

However, up to 3400 Hz is sufficient for articulation (intelligibility).

Fidelity is compromised!

Analog to Digital Conversion of Message Signal

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$$B = 3400 \text{ Hz}$$

$$f_s = 8000 > 2B$$

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Quantization level, $L = 256$ (8 bits)

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Data rate = $8000 * 8 = 64000$ pulse/second = 64 Kbps

Analog to Digital Conversion of Message Signal

Example 2: data rate for compact disc

Fidelity is required!

Audio signal b/w = 20 KHz

$$B = 20000 \text{ Hz}$$

$$f_s = 44100 \text{ Hz} > 2B$$

Quantization level, $L = 65,536$ (16 bits)

$$\text{Data rate} = 44100 * 16 = 1.4 \text{ Mbps}$$

Advantages of Digital Communication

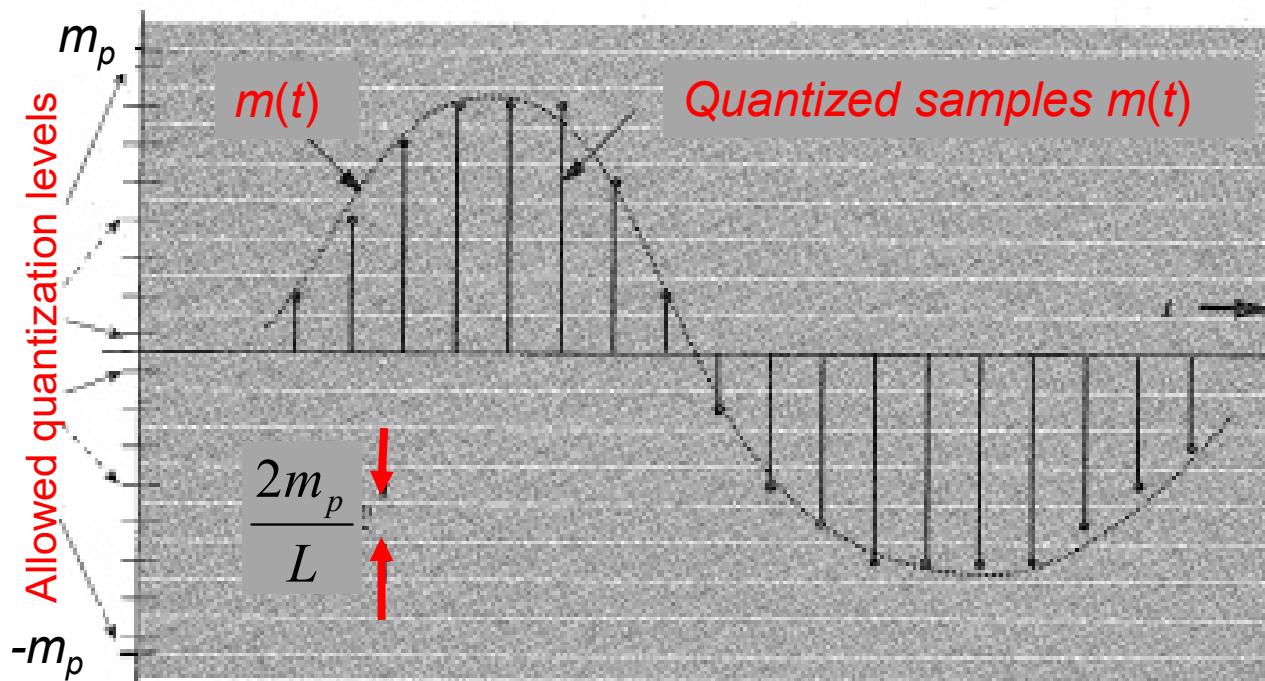
Self Study

Quantization

The range $(-m_p, m_p)$ is divided into L sub-intervals, each of magnitude Δv

$$\Delta v = \frac{2m_p}{L}$$

L is known as quantization level



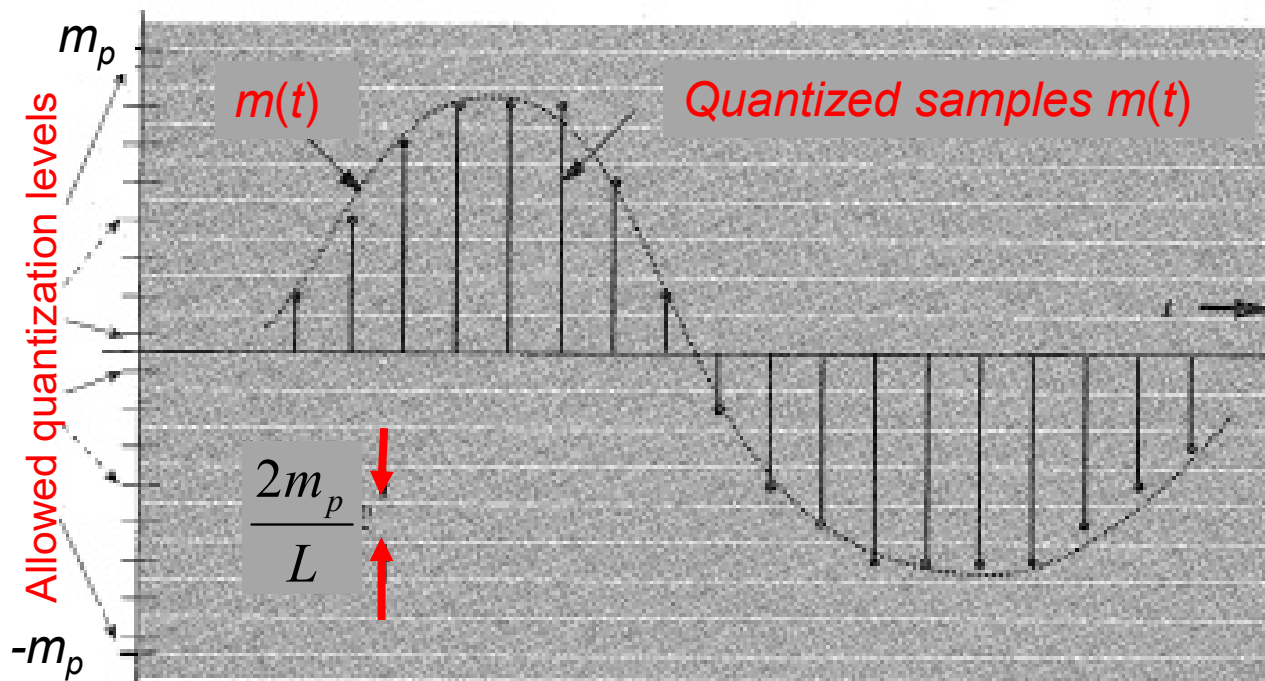
Quantization

m_p is NOT the signal PEAK, rather is it's the LIMIT of the quantizer

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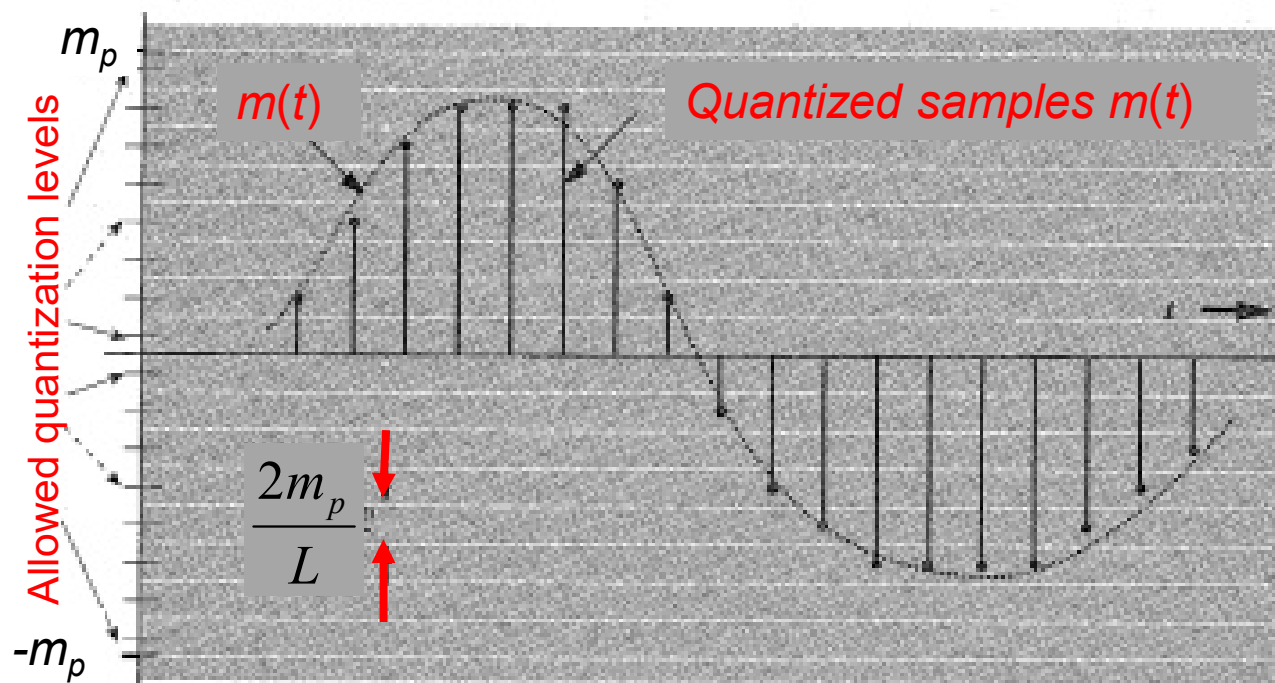
Quantization

k -th sample value $m(kT_s)$ is replaced by the midpoint of an interval where it lies

The range $(-m_p, m_p)$ is divided into L sub-intervals, each of magnitude Δv

$$\Delta v = \frac{2m_p}{L}$$

L is known as quantization level



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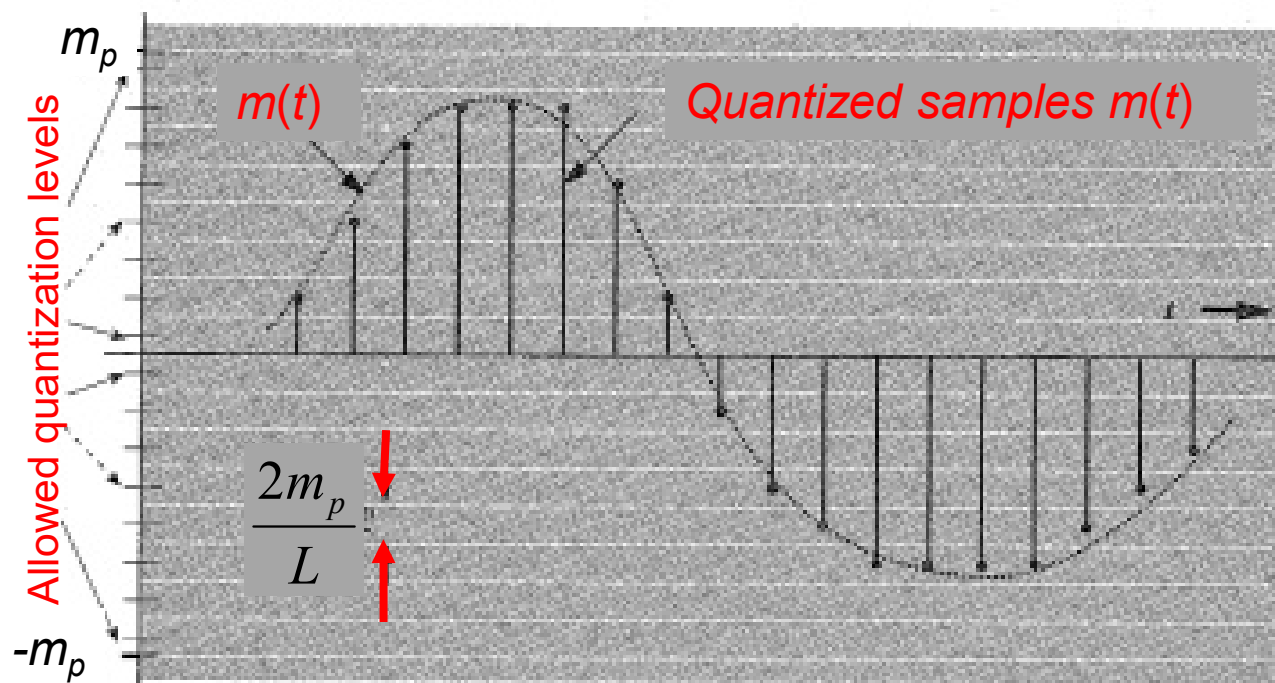
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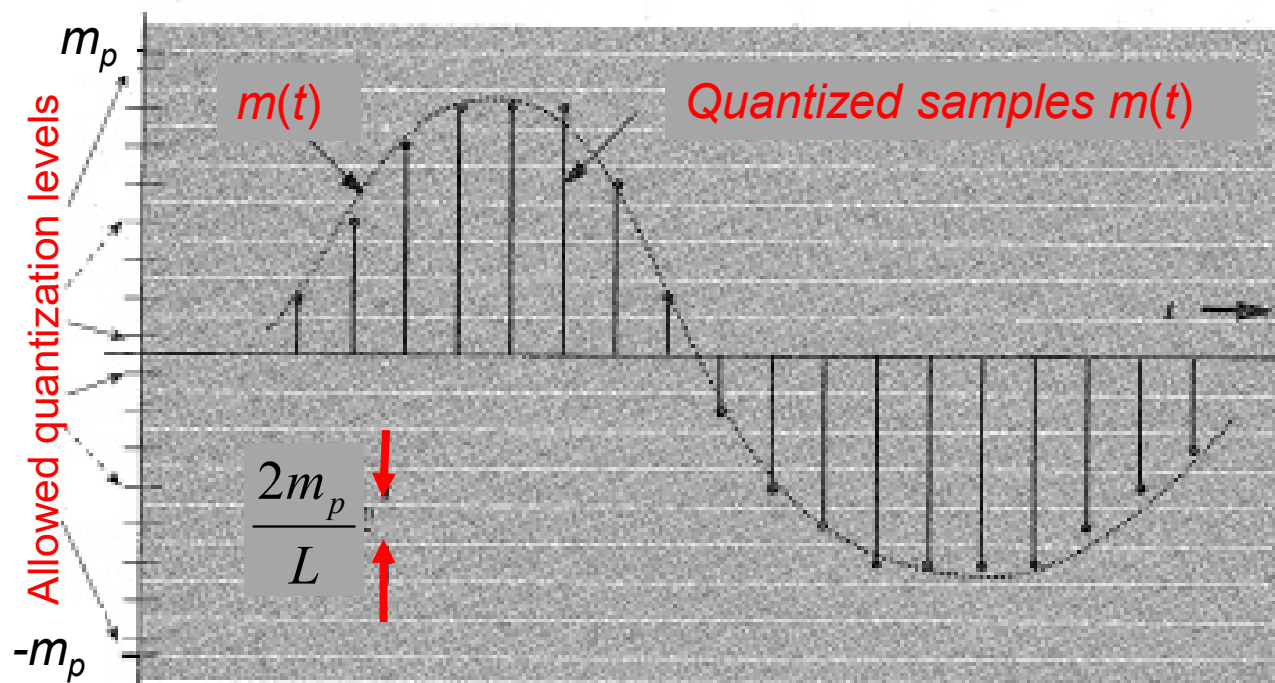


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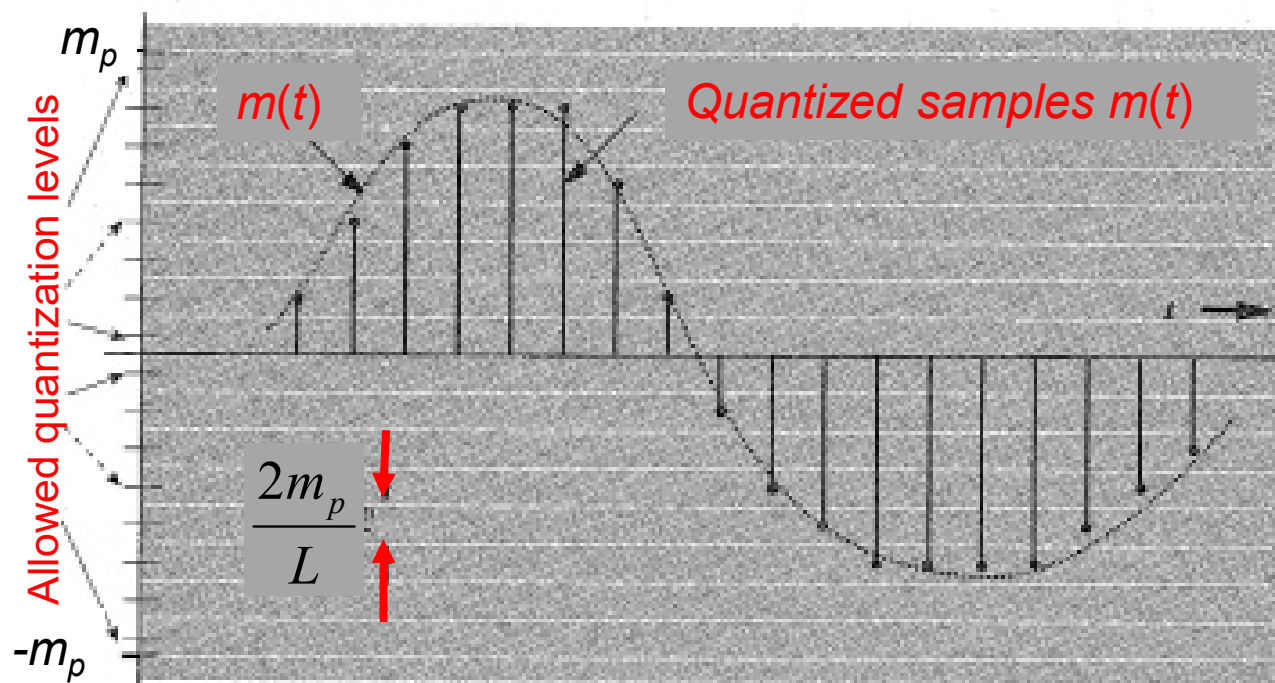
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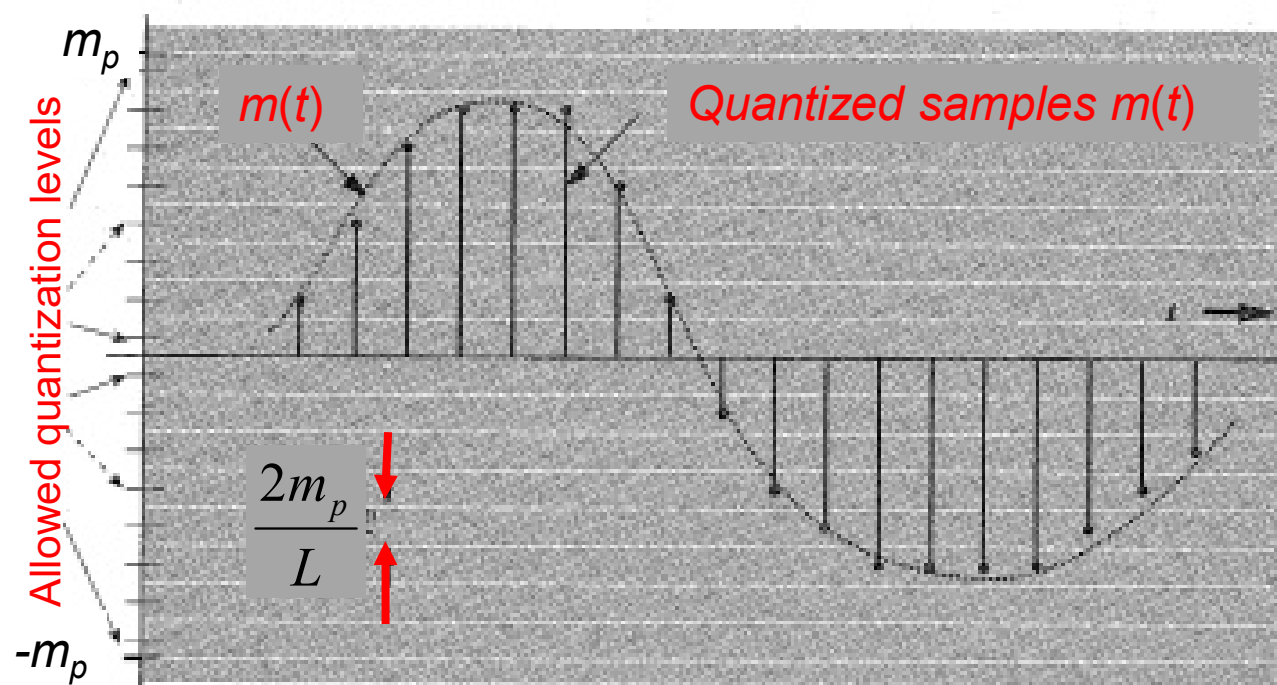
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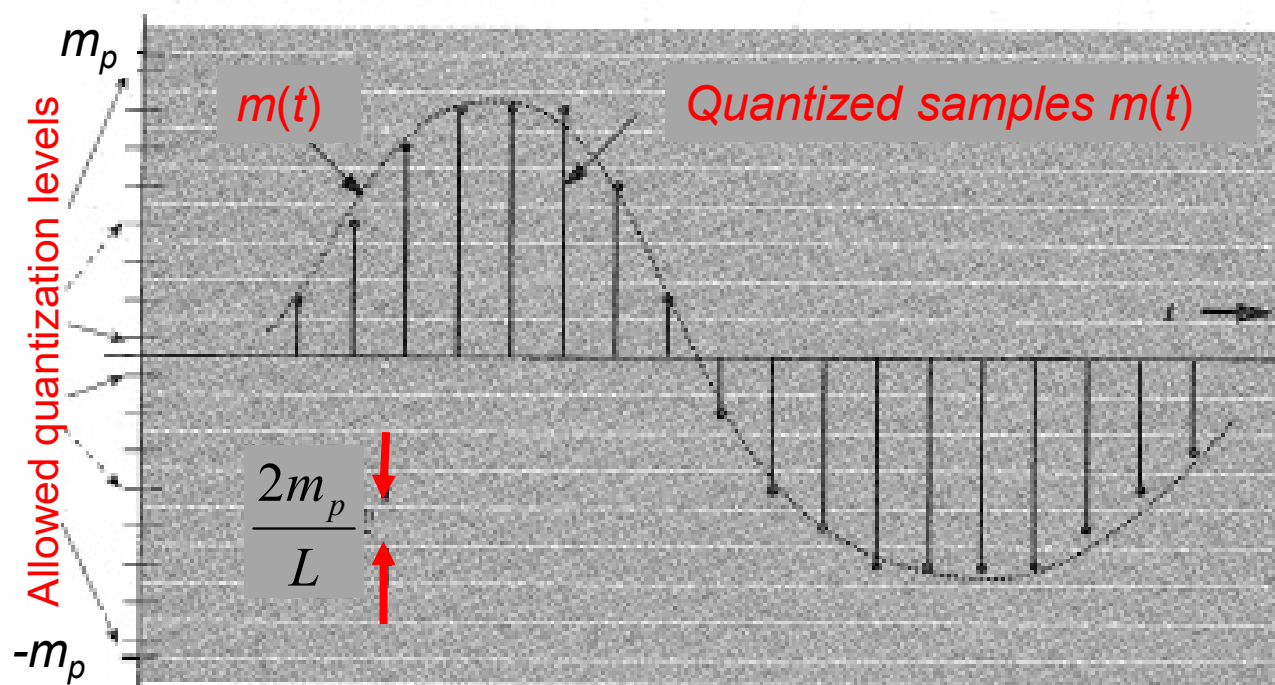
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$m(kT_s)$

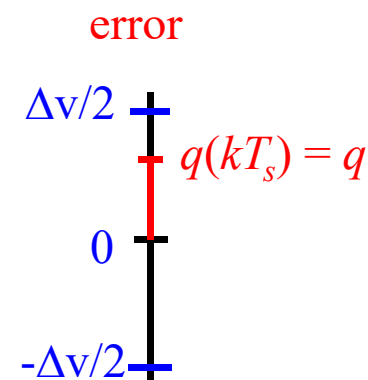
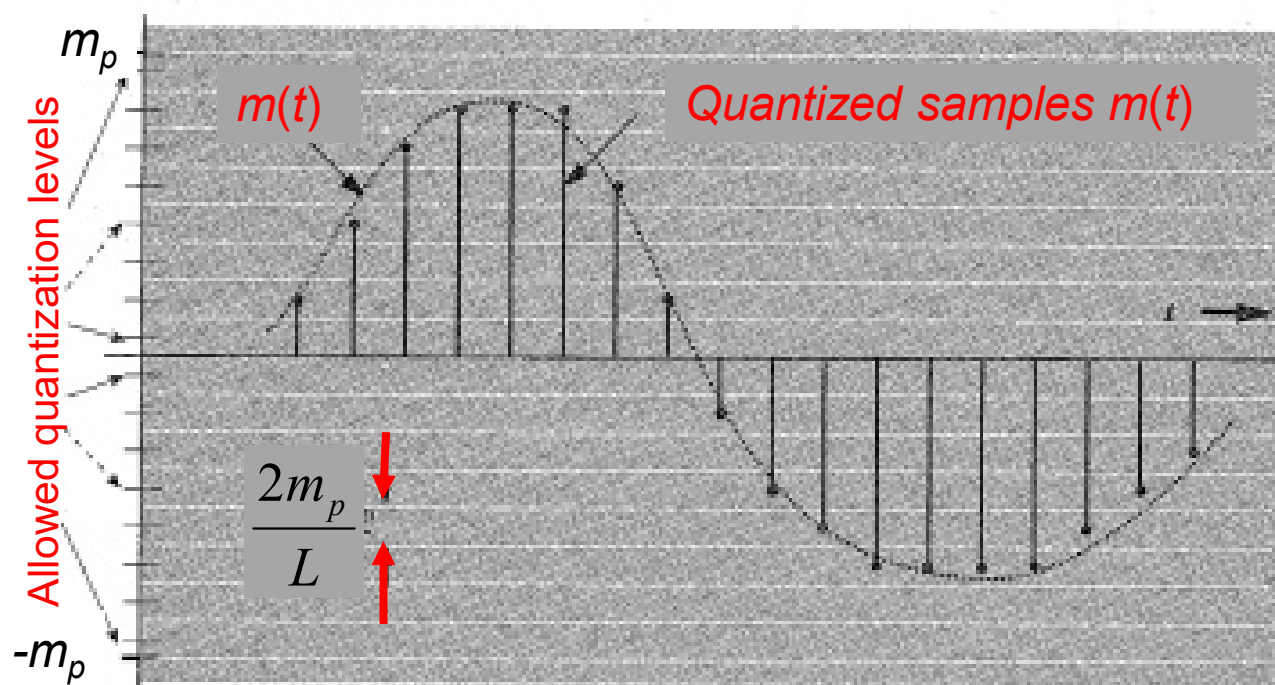
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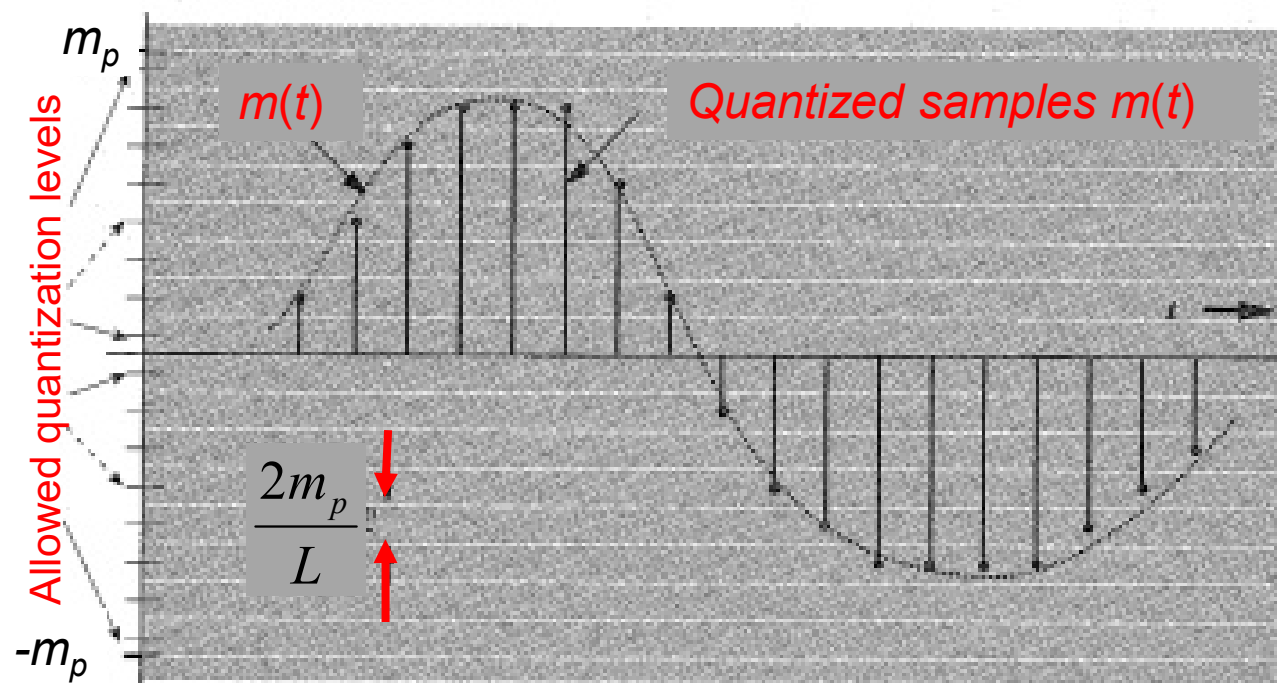


Diagram illustrating the frequency components of the signal $\hat{m}(kT_s)$ and the sampling rate $\Delta\nu$. The vertical line represents the frequency spectrum, with the top segment labeled $\hat{m}(kT_s) + \Delta\nu/2$, the middle segment labeled $\hat{m}(kT_s)$, and the bottom segment labeled $\hat{m}(kT_s) - \Delta\nu/2$. The bottom segment is also labeled $m(kT_s)$ in red.

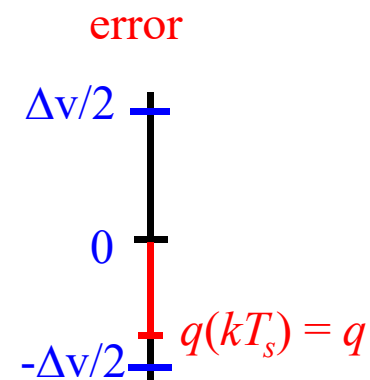
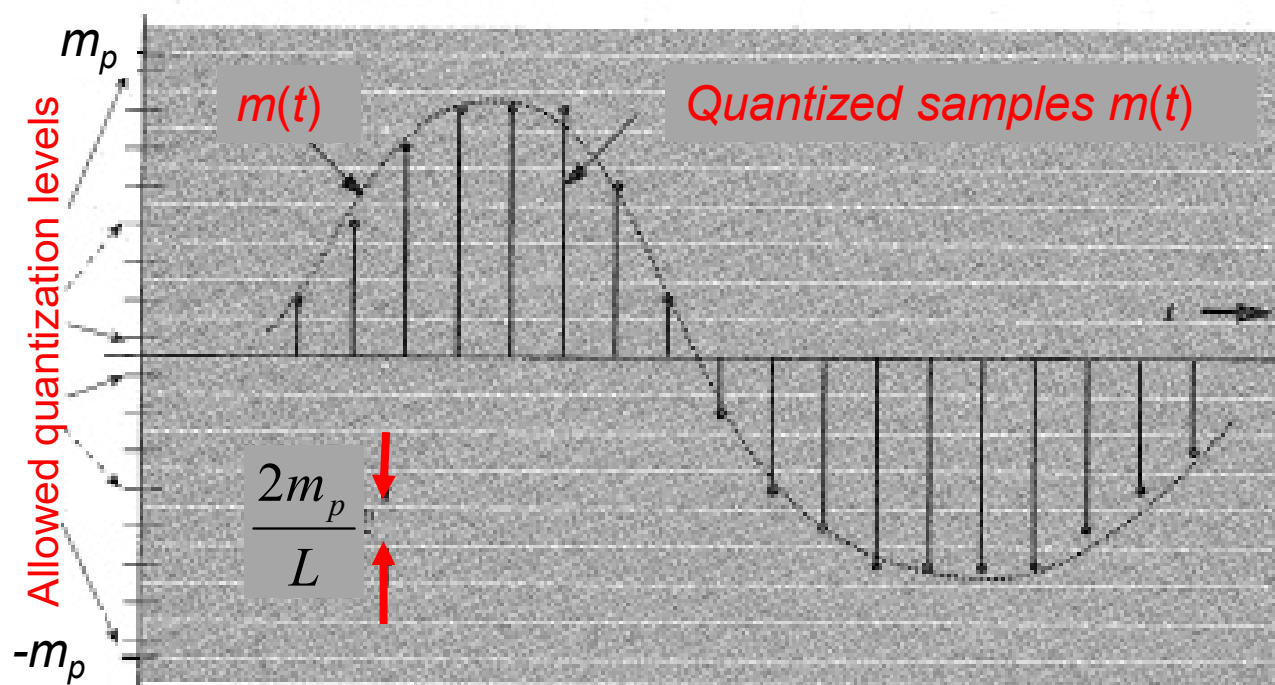
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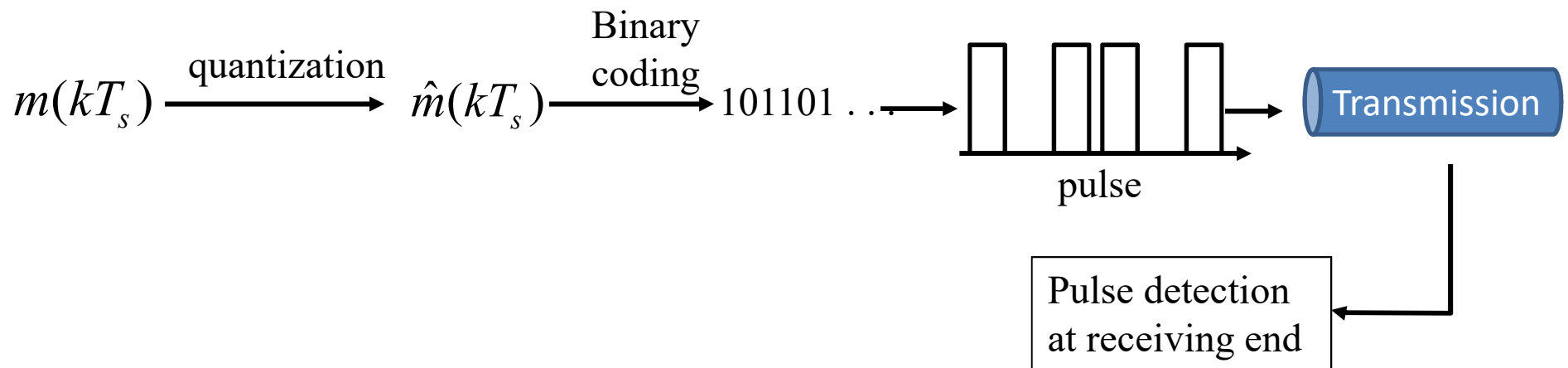
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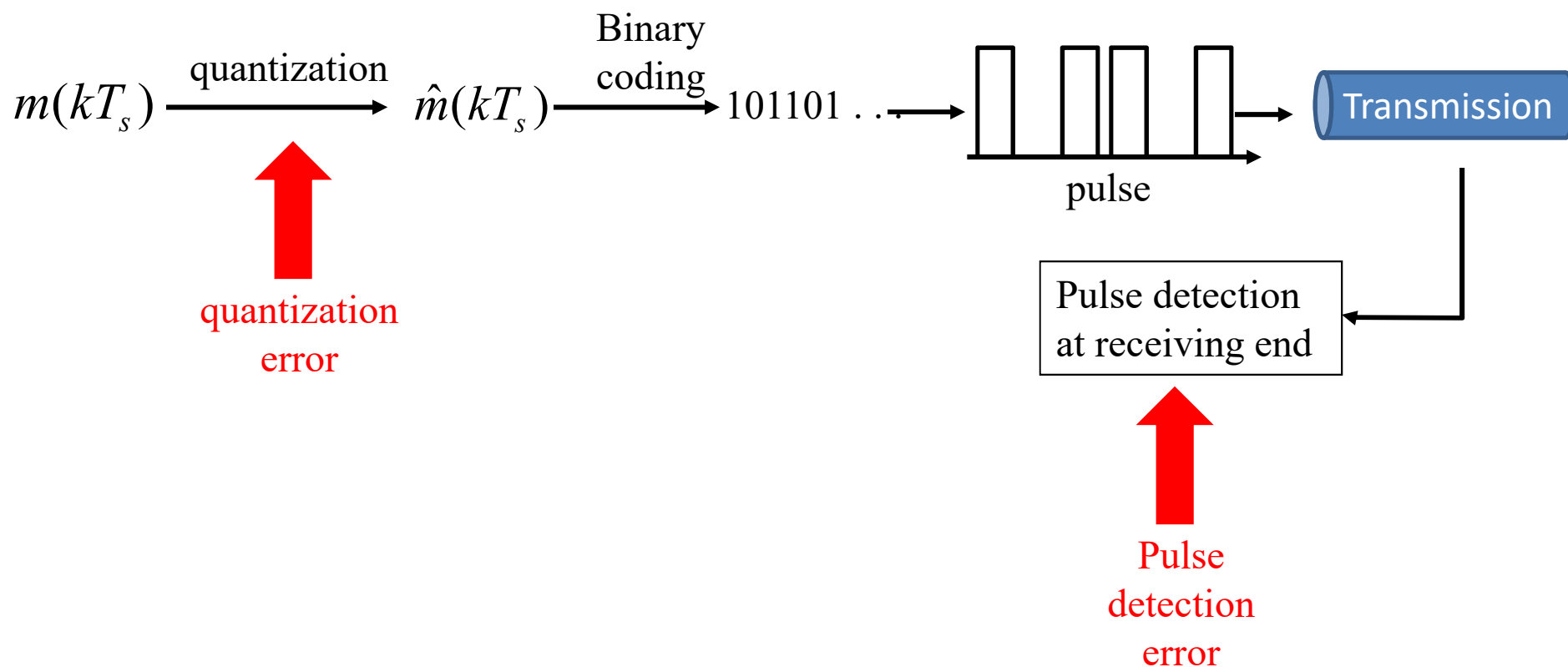
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If there were no quantization error,

$$m(t) = \sum_k m(kT_s) \text{sinc}(2\pi Bt - k\pi)$$

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Quantization error $q(t)$,

$$q(t) = \hat{m}(t) - m(t)$$

Quantization

Quantization error or quantization noise or undesired signal,

$$\begin{aligned} q(t) &= \sum_k [\hat{m}(kT_s) - m(kT_s)] \text{sinc}(2\pi Bt - k\pi) \\ &= \sum_k q(kT_s) \text{sinc}(2\pi Bt - k\pi) \end{aligned}$$

Quantization

Quantization noise,

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$q(kT_s)$ = Quantization
error for k th sample

Quantization

Power or Mean square of Quantization noise,

$$\begin{aligned} \overline{q^2(t)} &= \lim_{T \rightarrow \infty} \frac{1}{T} \int_{-T/2}^{T/2} q(t)^2 dt \\ &= \lim_{T \rightarrow \infty} \frac{1}{T} \int_{-T/2}^{T/2} \left[\sum_k q(kT_s) \text{sinc}(2\pi Bt - k\pi) \right]^2 dt \end{aligned}$$

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We can prove that,

$$\int_{-\infty}^{\infty} \text{sinc}(2\pi Bt - m\pi) \text{sinc}(2\pi Bt - n\pi) dt = \begin{cases} 0 & m \neq n \\ \frac{1}{2B} & m = n \end{cases}$$

Quantization

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$2BT = \text{total no. of samples over averaging time } T$

RHS is the mean of the square of quantization error

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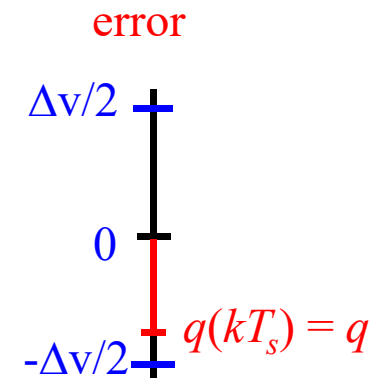
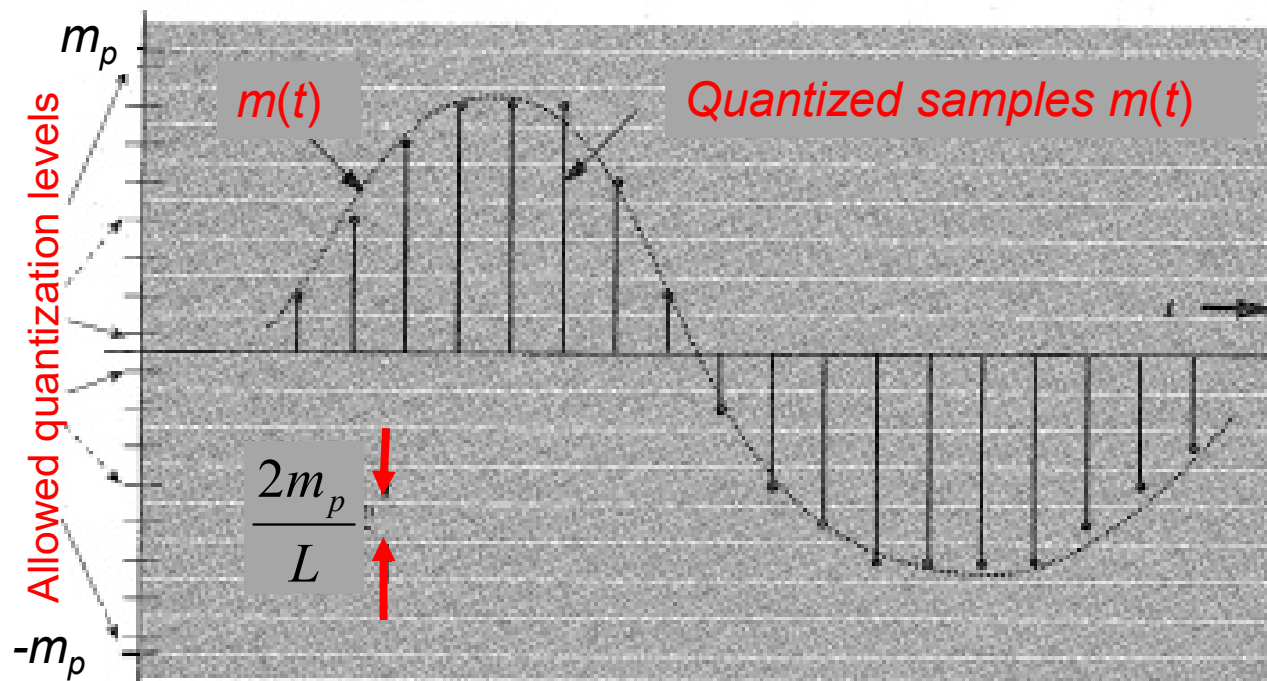
$2BT = \text{total no. of samples over averaging time } T$

RHS is the mean of the square of quantization error

Therefore, power of quantization noise = mean square quantization error

Quantization

We know, quantization error q lies in $(-\Delta v/2, \Delta v/2)$

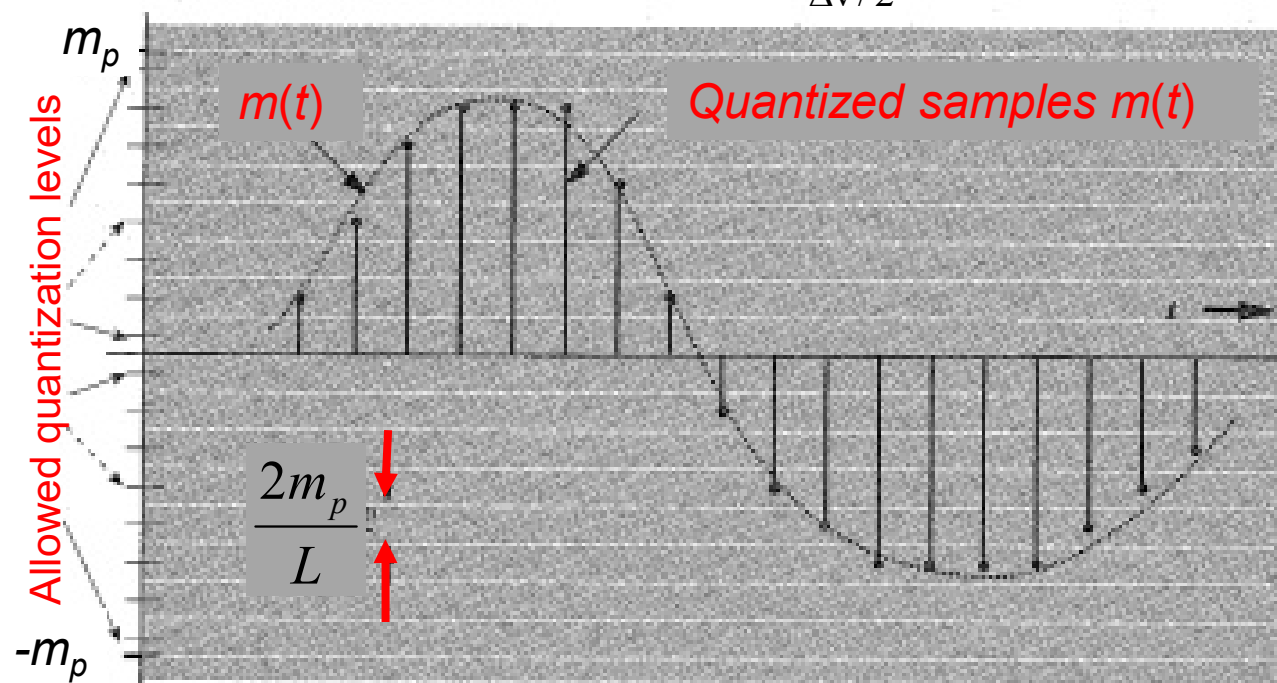


$$\Delta v = \frac{2m_p}{L}$$

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Mean square quantization error is given by

$$\tilde{\tilde{q}}^2 = \frac{1}{\Delta v} \int_{-\Delta v/2}^{\Delta v/2} q^2 dq$$



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Assume, power of message signal (S_0) is given by $S_0 = \overline{m^2(t)}$

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Signal-to-noise ratio (SNR) is

$$SNR = \frac{S_0}{N_0} = 3L^2 \frac{\overline{m^2(t)}}{m_p^2}$$

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$$SNR = \frac{S_0}{N_0} = 3L^2 \frac{\overline{m^2(t)}}{m_p^2}$$

- Higher SNR means higher quality of received signal
- L increases SNR
- Higher limit of quantizer (m_p) decreases SNR

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For these reasons,

- SNR varies widely
- Quality of received signal deteriorates remarkably for soft speakers

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For these reasons,

- SNR varies **widely**
- **Quality** of received signal **deteriorates remarkably** for soft speakers

However statistically,

- **Small amplitudes** (soft speakers) **predominate** in speech
- **Larger amplitudes** (loud speakers) are **less frequent**