

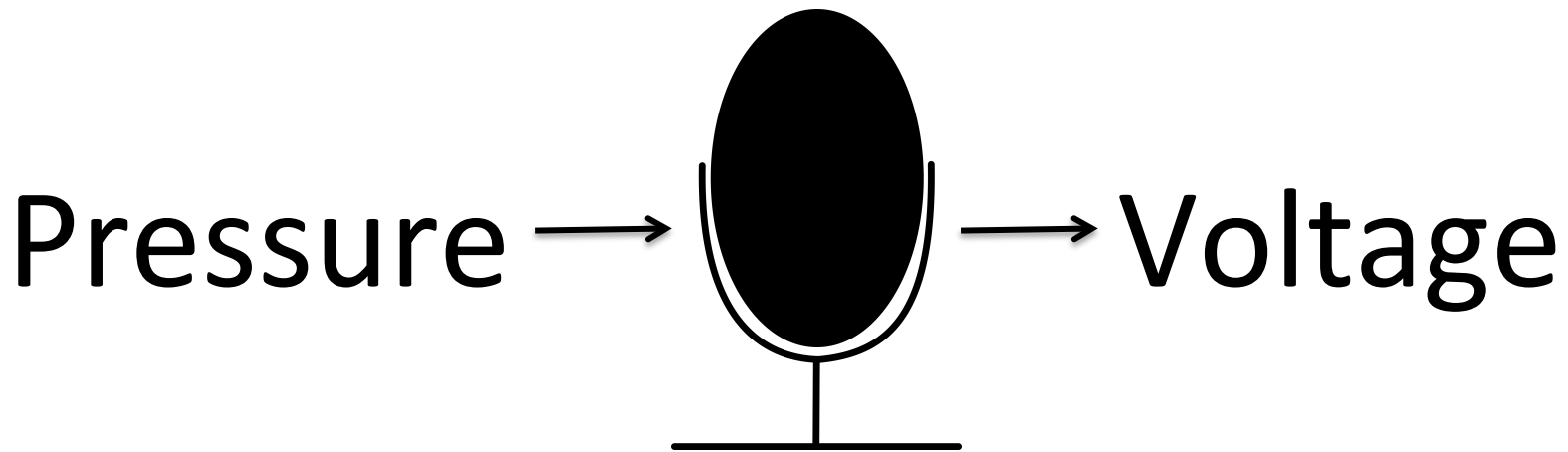
## Lecture 2

# Audio Capture and Compression

# Audio is a wave phenomenon

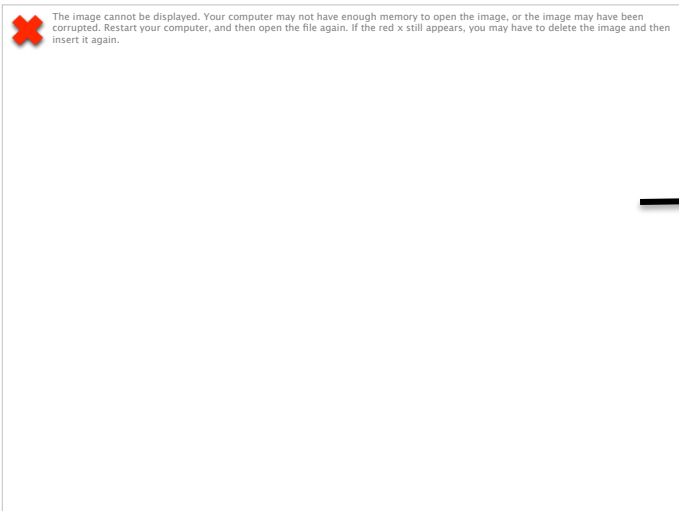
- Speaker moves back and fourth and generates longitudinal pressure waves
- Ear perceives that as sound
- No air, no sound

# Pressure to Voltage Conversion

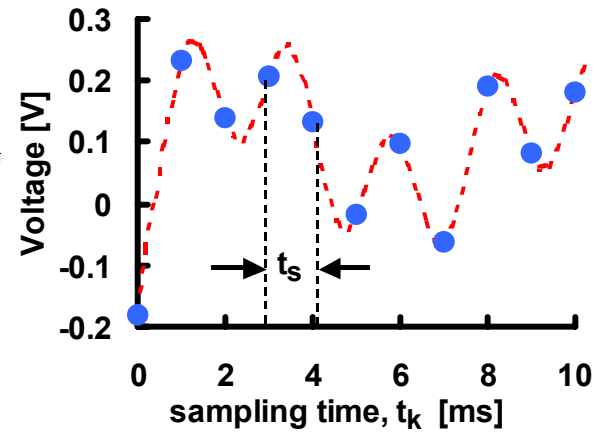


# Analogue

# Digital

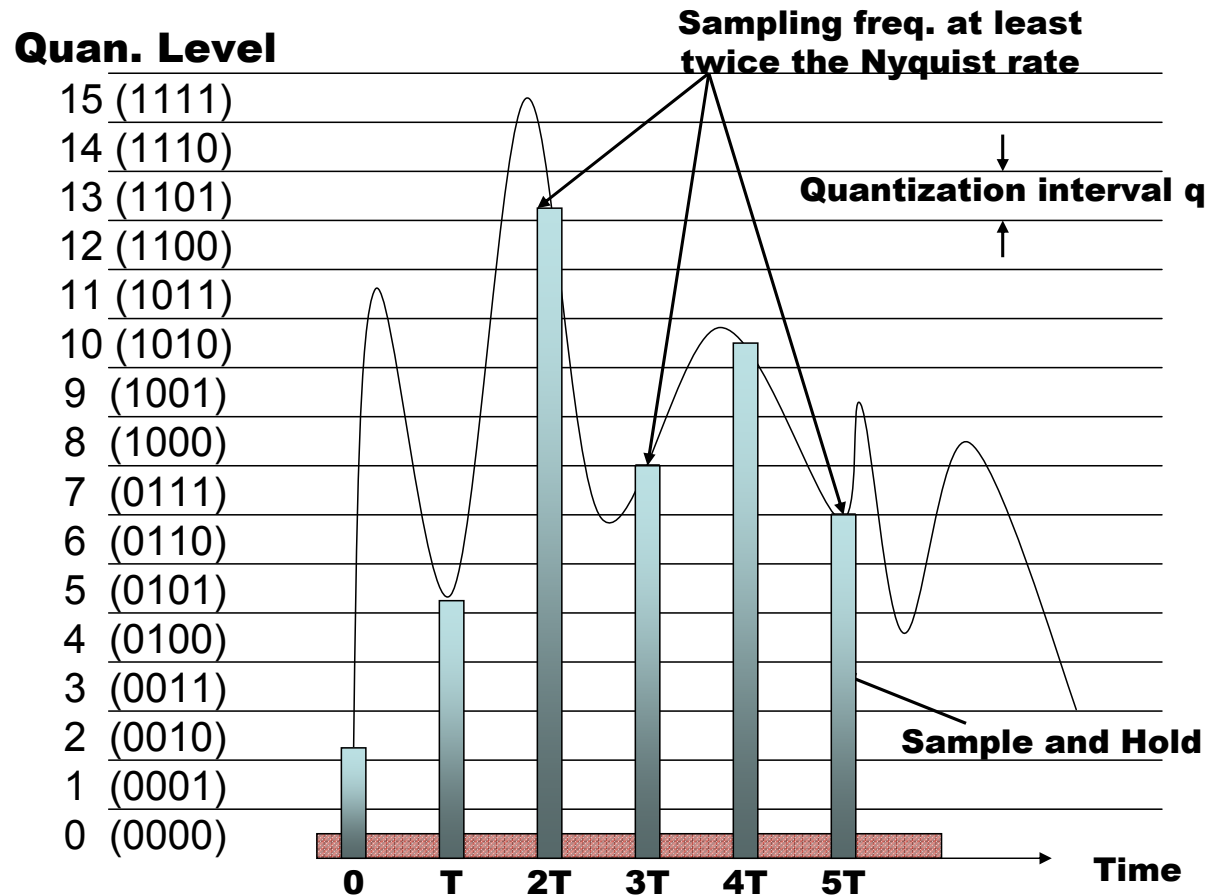


# ADC

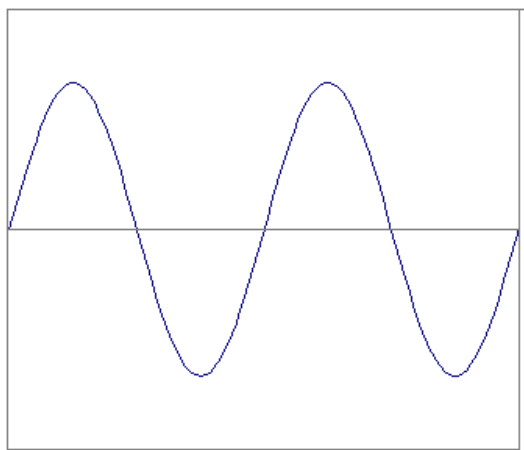


# Discretization

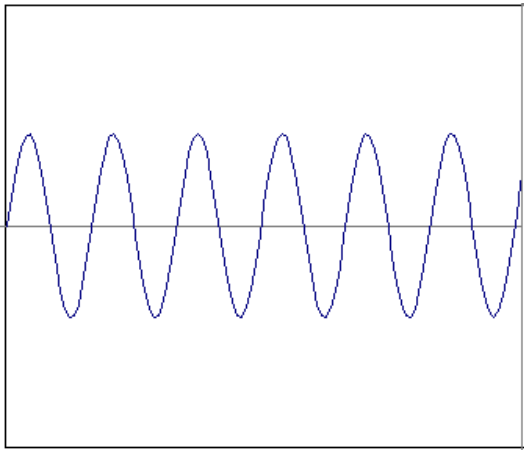
- Time axis
  - sampling
- Amplitude axis
  - quantization



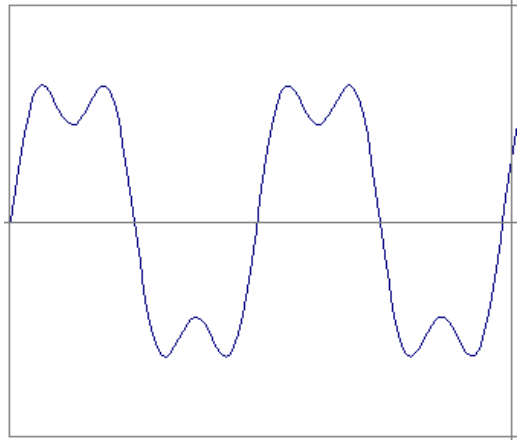
# Frequency Components of Audio Signal

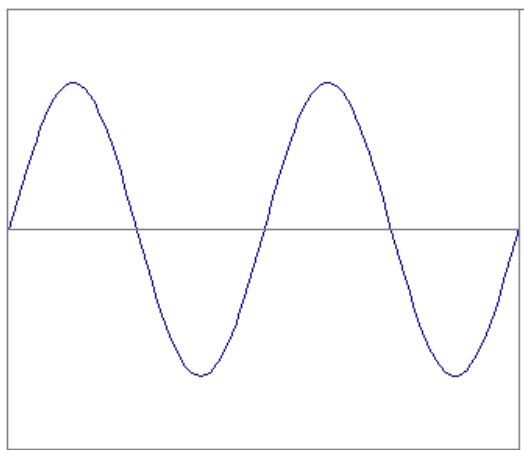


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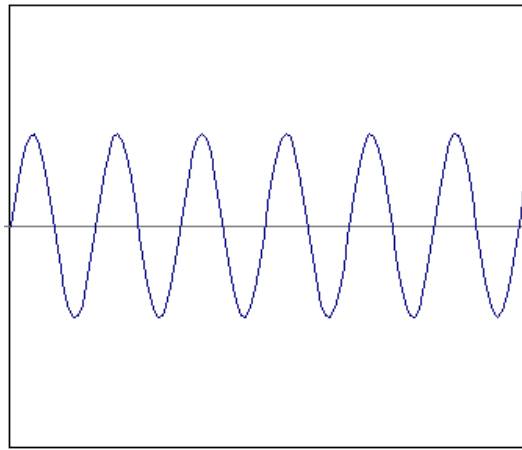


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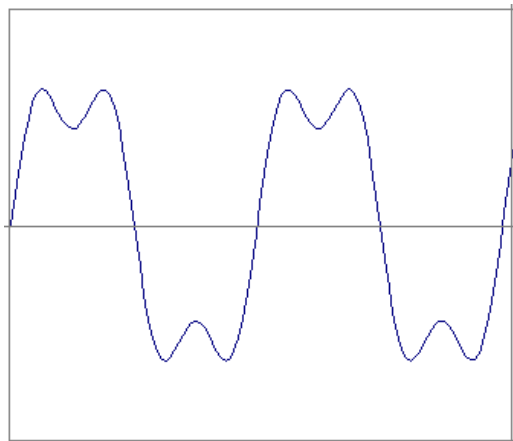




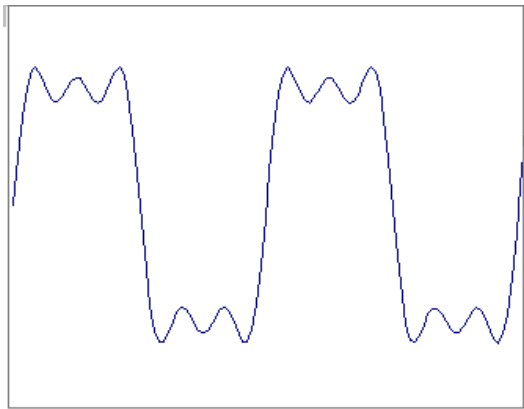
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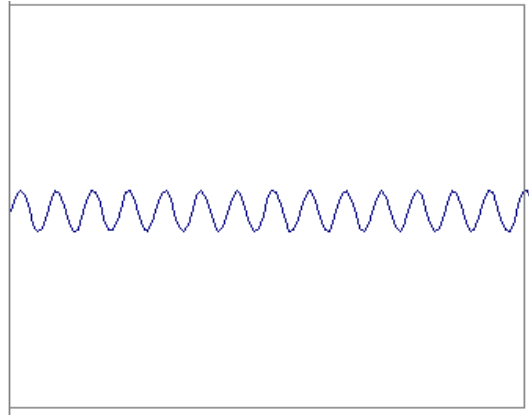
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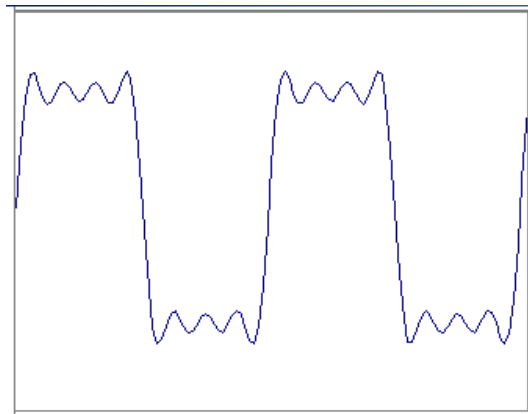


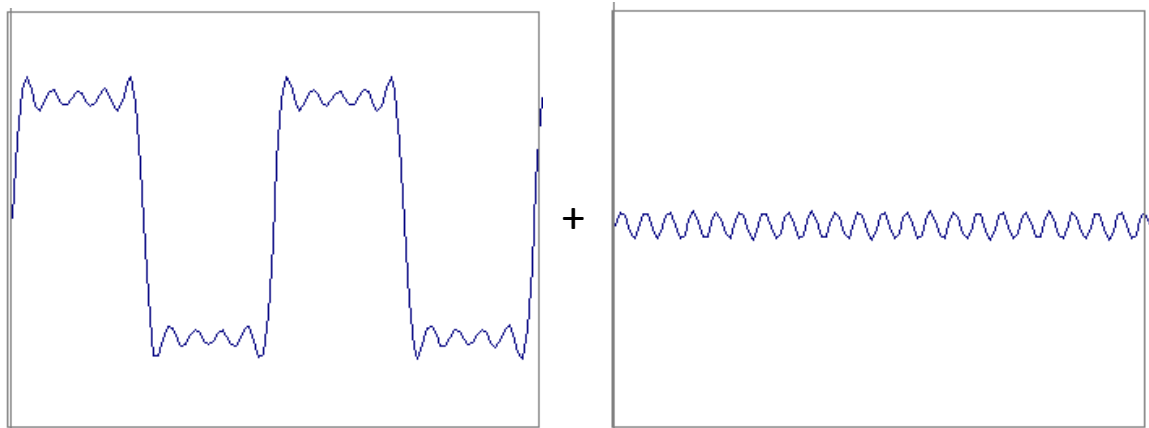


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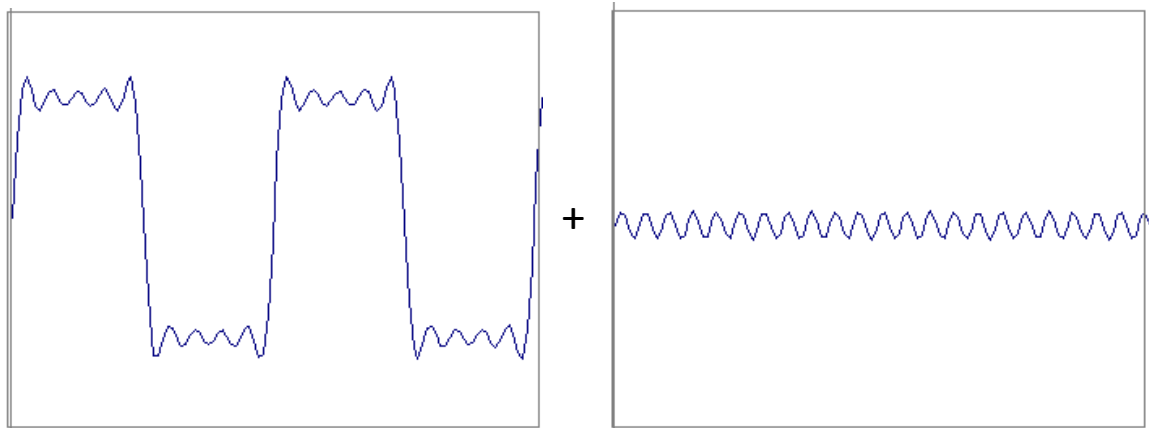
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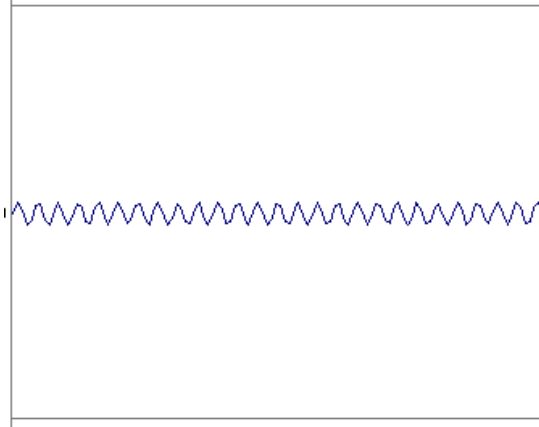


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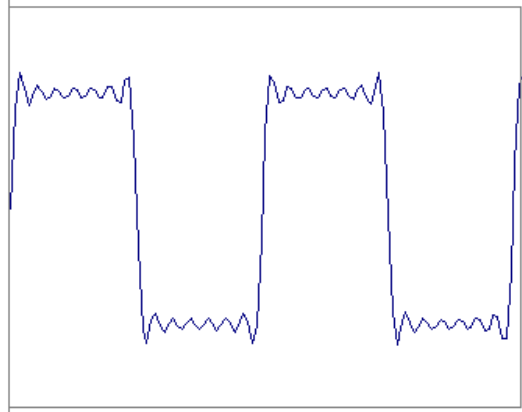


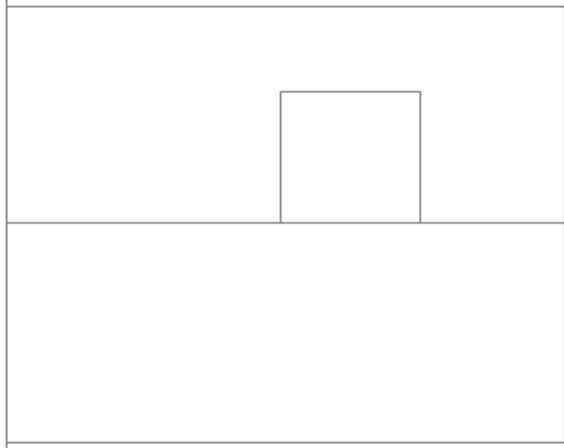


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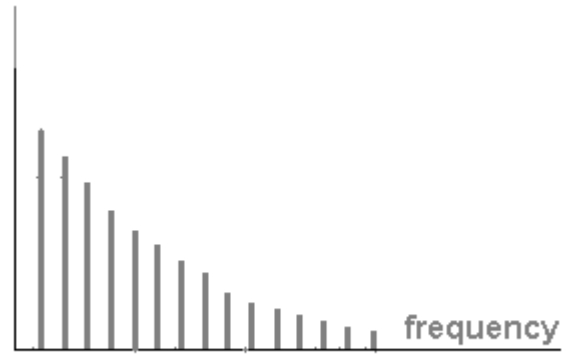


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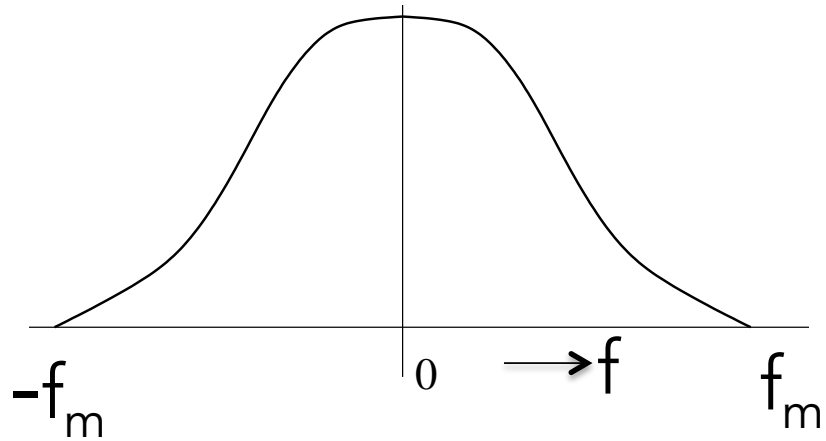
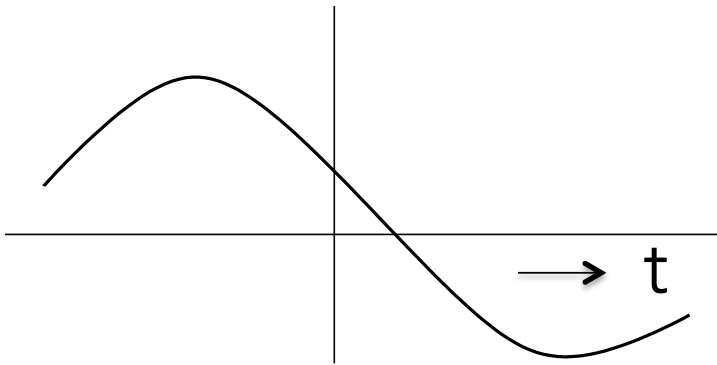




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# Time Domain Vs Frequency Domain



# Sampling Theorem

A signal can be reconstructed exactly if it is sampled at a rate at least twice the maximum frequency component in it!

$$\text{Nyquist rate} = 2f_m$$



What should be sampling  
rate for audio?

Audible Range: 20 Hz to 20 kHz

Sample (music) > 40k samples

Voice Range: 0 to 4 kHz!

Sample(speech) > 8k samples

How do you ensure  
no aliasing?

Low pass filter the signal before  
passing to ADC!

# Quantization

- Representing large set of values with a smaller number of values.
- The large set may have continuous values also.

Signal to Quantization  
Noise Ratio

$$\text{SQNR} = 6.02\text{NDB}$$

Exercise: Quantize the following 5 bit signals into 2 bit signals!

{23, 12, 9, 5, 31, 16, 19, 4, 13, 22}

- There are four code-words: 0, 1, 2, 3
- Obtain interval each code-word represents to obtain codes
- Obtain representative value corresponding to each code-word to decode
- Put all this information in a table.

# Linear Vs Non-linear Quantization

- Linear Quantization: equal step
- Non-linear Quantization: unequal steps

# Pulse Code Modulation

- Each audio sample is represented by an integer code-word.
- Linear PCM uses linear quantization and non-linear PCM uses non-linear quantization
- Non-linear PCM is also called companding



# Weber's Law

$$\Delta\text{Response} \propto \frac{\Delta\text{Stimulus}}{\text{Stimulus}}$$



100



200



500



600



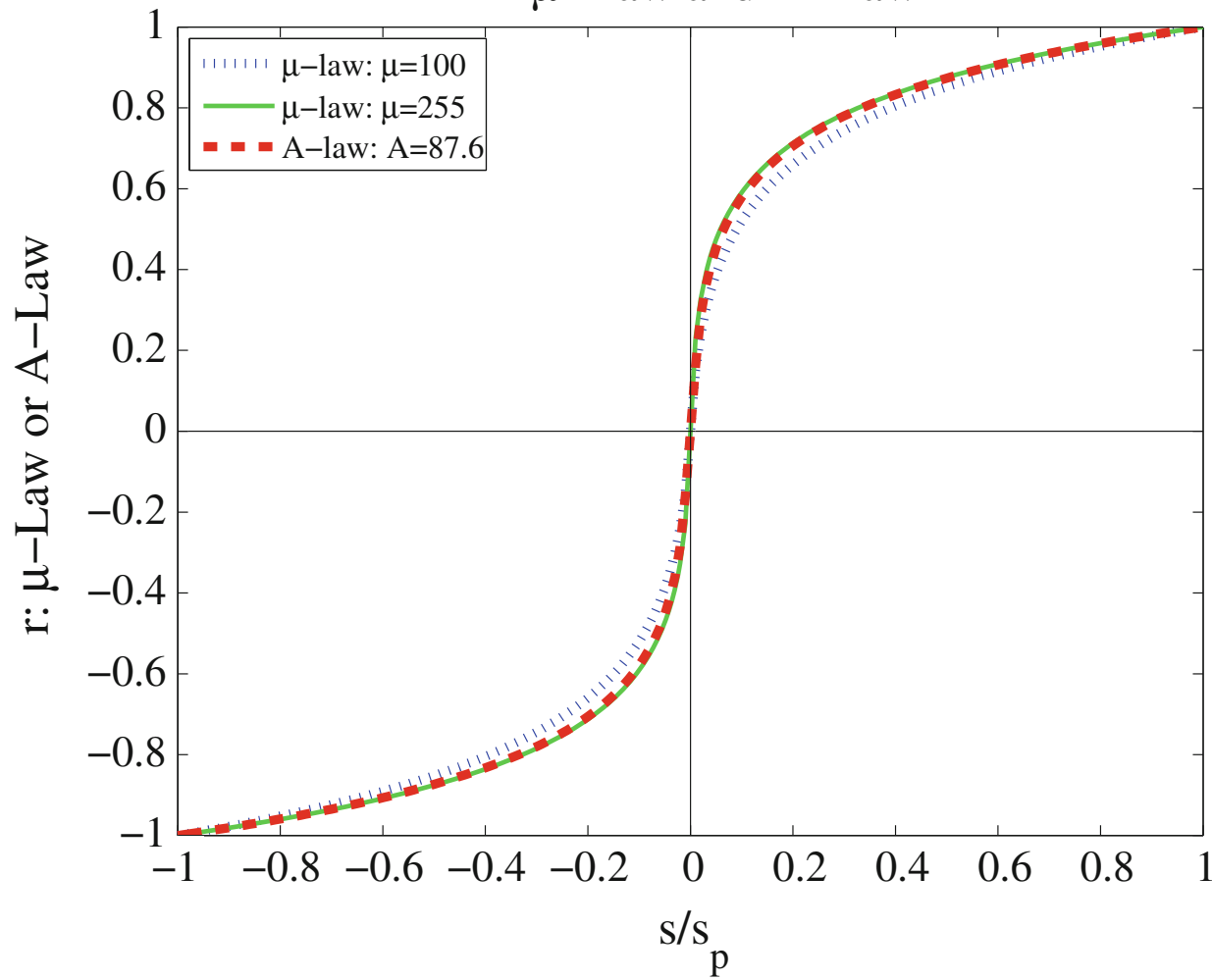
1200



1300

# Companing

$\mu$ -Law and A-Law



$\mu$ -law  
Compressing

$$r = \frac{\text{sign}(s)}{\ln(1 + \mu)} \ln \left\{ 1 + \mu \left| \frac{s}{s_p} \right| \right\}$$

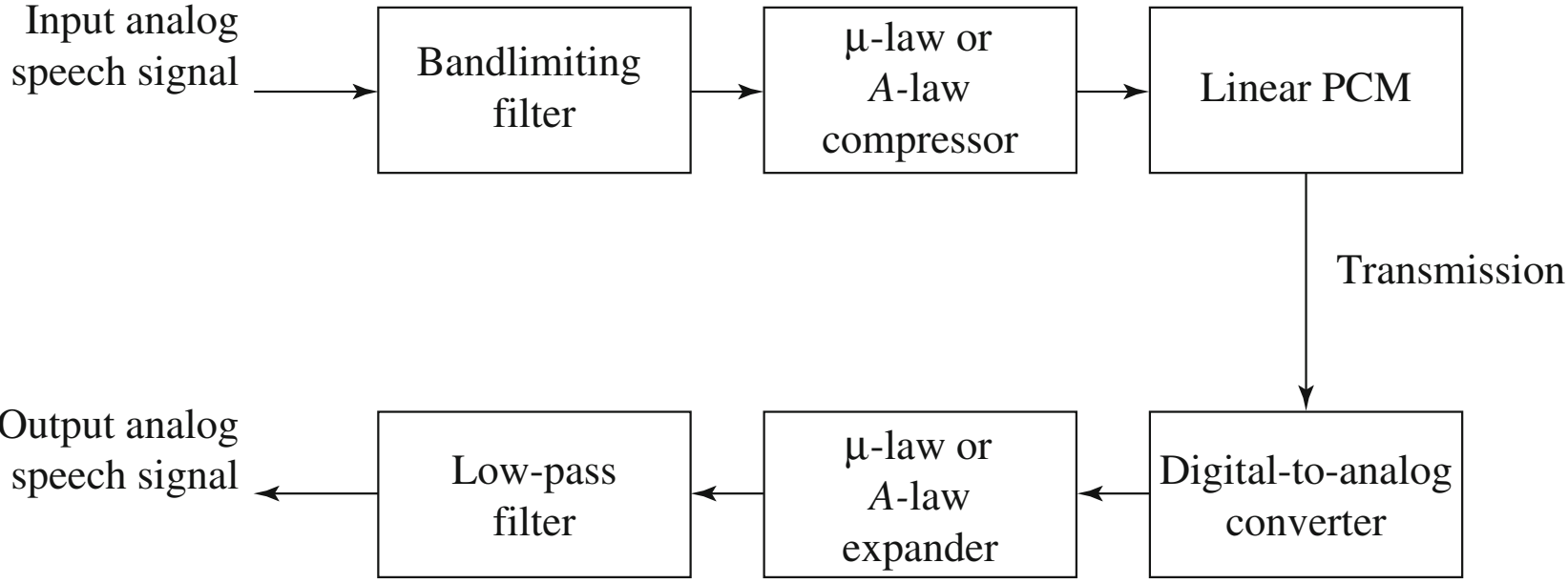
A-law  
Compressing!

$$r = \begin{cases} \frac{A}{1 + \ln A} \left( \frac{s}{s_p} \right), & \left| \frac{s}{s_p} \right| \leq \frac{1}{A} \\ \frac{\text{sign}(s)}{1 + \ln A} \left[ 1 + \ln A \left| \frac{s}{s_p} \right| \right], & \frac{1}{A} \leq \left| \frac{s}{s_p} \right| \leq 1 \end{cases}$$

$$\text{where } \text{sign}(s) = \begin{cases} 1 & \text{if } s > 0, \\ -1 & \text{otherwise} \end{cases}$$

# How to Implement Compressing?

1. Use non-uniform quantization steps in the ADC internally
2. Use additional nonlinear analog circuit before linear ADC
3. Use a 12 bit ADC and a software lookup table to get the codes



Comanding in mainly used  
in Telephony!

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Quality	Sampling rate (kHz)	Bits per sample	Mono/ Stereo	Bitrate (if uncompressed) (kB/s)	Signal bandwidth (Hz)
Telephone	8	8	Mono	8	200–3,400
AM radio	11.025	8	Mono	11.0	100–5,500
FM radio	22.05	16	Stereo	88.2	20–11,000
CD	44.1	16	Stereo	176.4	5–20,000
DVD audio	192 (max)	24 (max)	Up to 6 channels	1,200.0 (max)	0–96,000 (max)

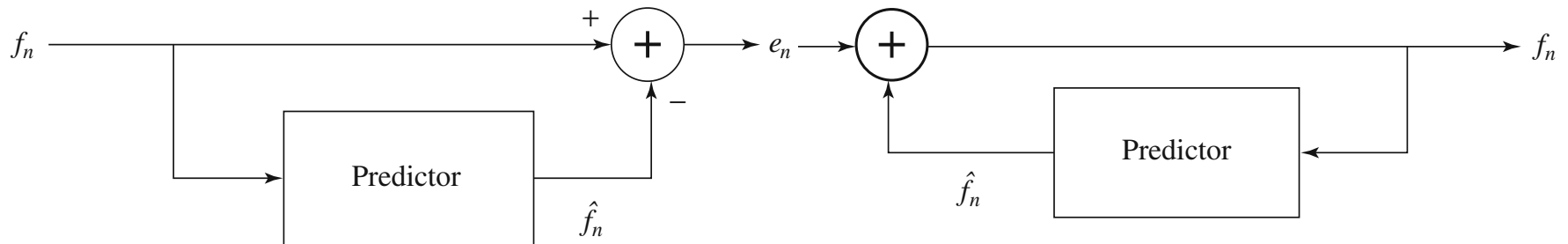
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# Differential Coding

- In real life, things vary smoothly, hence the differences are small.
- Encode the current sample based on the value of previously encoded sample!

# Lossless Predictive Coding



# What is the goal of predictor?

Based on the current and past samples, predict a value as close to the next sample value as possible!

Would taking difference  
always compress the  
signal?

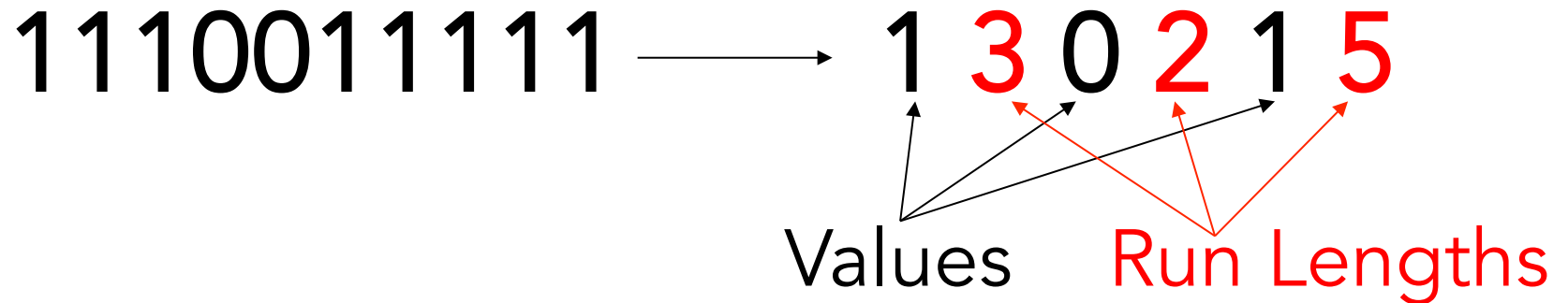
# Case 1: differences are limited to a small range

- E.g. -14, -12, -10, -5, 4, 11, 15, -3
- Range is -16 to + 15
- Need 5 bits to encode each sample

# Case 2: differences consists of runs of numbers

- This will happen when input mostly varies linearly
  - e.g. 1,1,1,0,0,-1,-1,-1,-1
- Count the run length, and just send the count for each symbol
  - 1(3),0(2),-1(4)

# Run Length Encoding

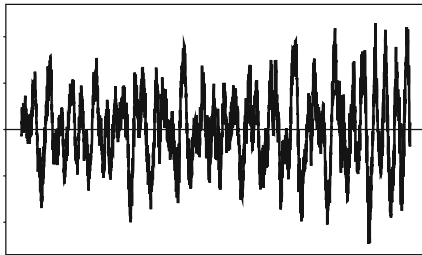


# Case 3: differences are not limited to a small range

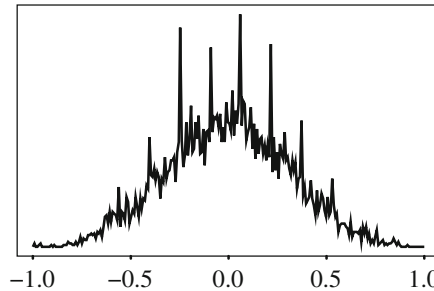
- The maximum possible range is -512 to +512
- It is actually double of the original signal range
- In this case, observe the histogram of the differences



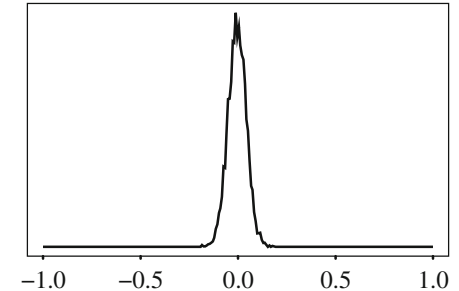
# Histogram of differences is more peaked!



Input Signal



Sample values



Sample differences

# Assign short codes to prevalent values!

For exceptionally large differences, use SU (+32) and SD (-32) symbols!

# Huffman Codes for the Following Source

A:(15), B:(7), C:(6), D:(6), E:(5)

Huffman coding is also called

- Entropy coding
- Variable length coding
- Prefix coding
- Source coding

Limitation: Bits per symbol  
can never be less than  
entropy of the source!

This is also limit of any  
lossless compression method!

Let us represent the  
differences in a fewer  
number of levels!

Quantization!

# Example

For 8 bit integer values, error is in the range -255 to 255

- 511 levels
- quantization step = 16
- code-words = 32
- representative value is midway of step
- the lookup table has steps, code (0 to 31), and quantized error

# How to choose quantization step?

- Bigger step needs less bits but produces more distortion
- Smaller step will increase the number of bits and reduce compression
- Optimal solution will need non-linear quantization



Goal: for a fixed number of levels, design best non-linear quantization scheme!

# Minimize Quantization Error on a Patch

$$\min \sum_{n=i}^{i+N-1} (f_n - Q[f_n])^2$$

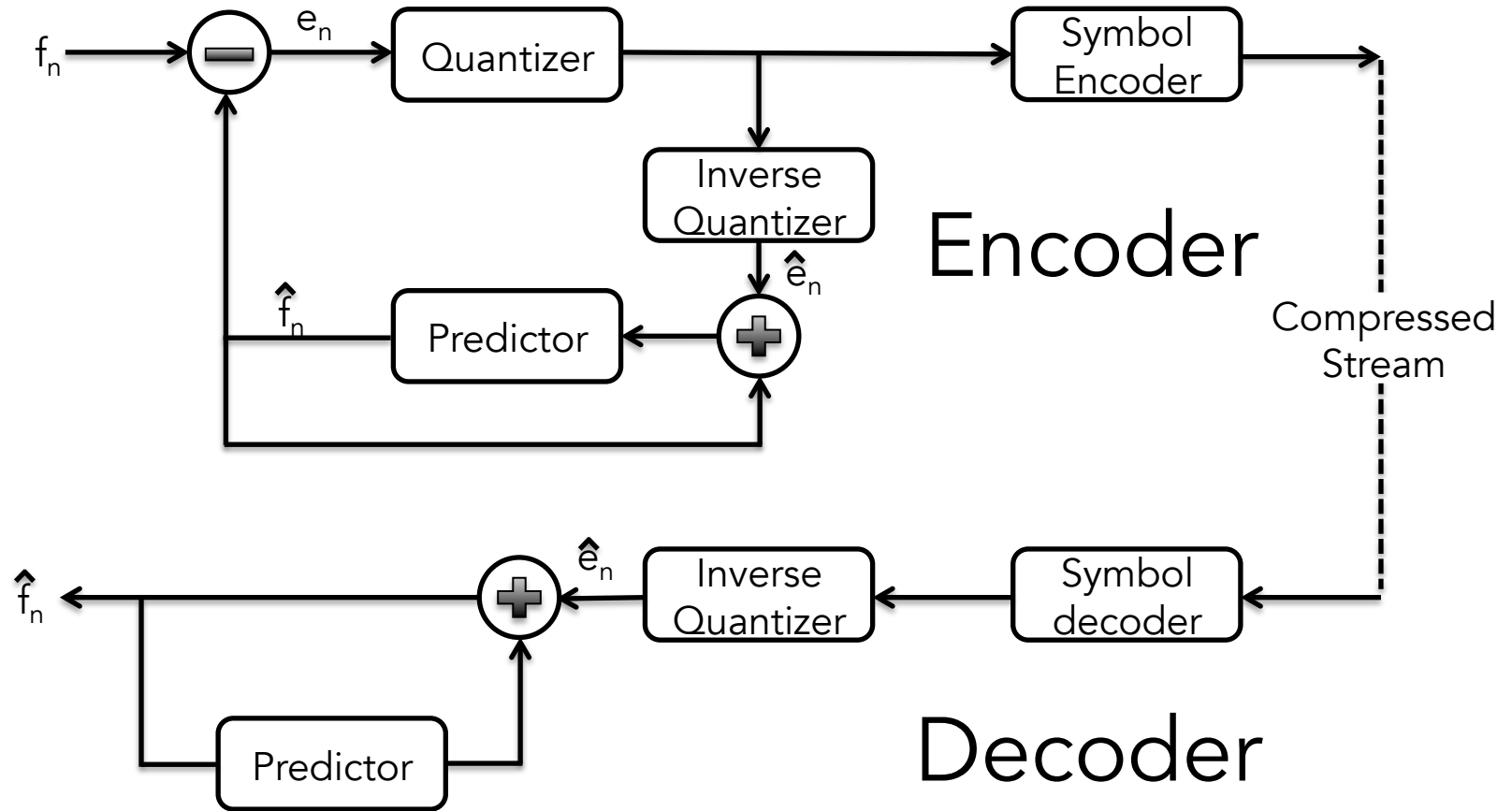
# Symbol (Sample Value) Distribution

- Gaussian
- Laplacian
- Non-parameterized

# Lloyd-Max Quantizer

$$\min \sum_{n=i}^{i+N-1} (d_n - Q[d_n])^2 l(d_n)$$

# Differential PCM (DPCM)



# Example

	$f_1$	$f_2$	$f_3$	$f_4$	$f_5$	Input Frames
$\hat{f} =$	130	130	142	144	167	
$e =$	0	20	-2	56	63	
$\tilde{e} =$	0	24	-8	56	56	
$\tilde{f} =$	130	154	134	200	223	

Initialization