

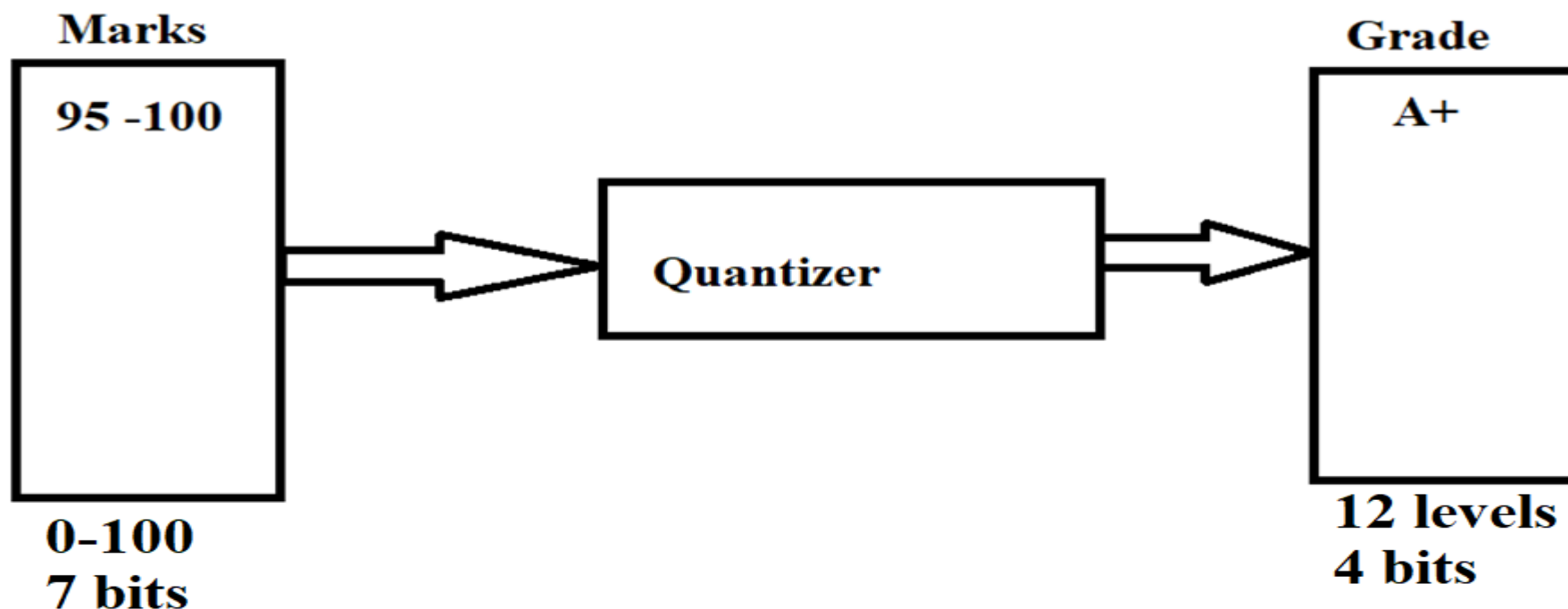
# **Data Compression**

## **Lossy Compression** **Scalar Quantization**

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## Quantization:

A process of representing a large, possibly infinite, set of values with a much smaller set.



- Reconstruct:  $(95-100) \rightarrow A+ \rightarrow 97$
- Quantization is one of the simplest and most general idea in lossy compression.

# Quantizer:

**There are 2 types:**

1) Scalar Quantization

➤ **Uniform Quantization.**

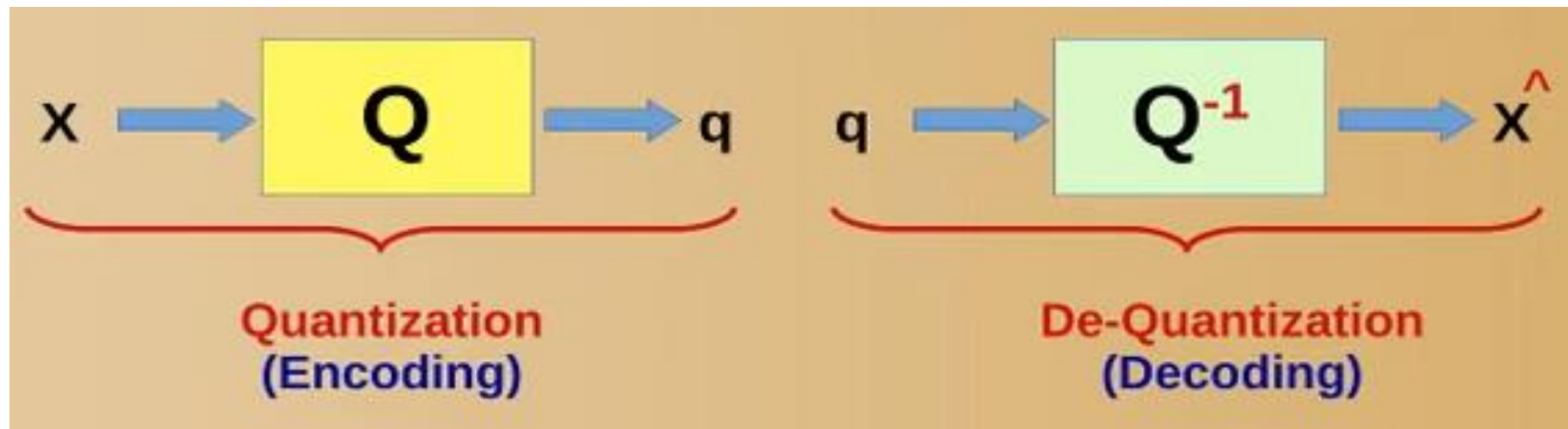
➤ Non-uniform (Optimal) Quantization.

2) Vector Quantization

## **1- Uniform Scalar Quantizer:**

- A uniform scalar quantizer partitions the domain of input values into equally spaced intervals.
- Each interval is represented by a distinct codeword ( $Q$ ).
- The output or reconstruction value ( $Q^{-1}$ ) corresponding to each interval is taken to be the midpoint of the interval.
- The length of each interval is referred to as the step size.

# Quantization and Dequantization:



- $x$ : input value
- $Q$ : codeword for  $x$  (Encoded value of  $x$ )
- $\hat{x}$ : Output value (Reconstructed values of  $x$ )

## Uniform Quantizer (Encoding):

- Input Output mapping.

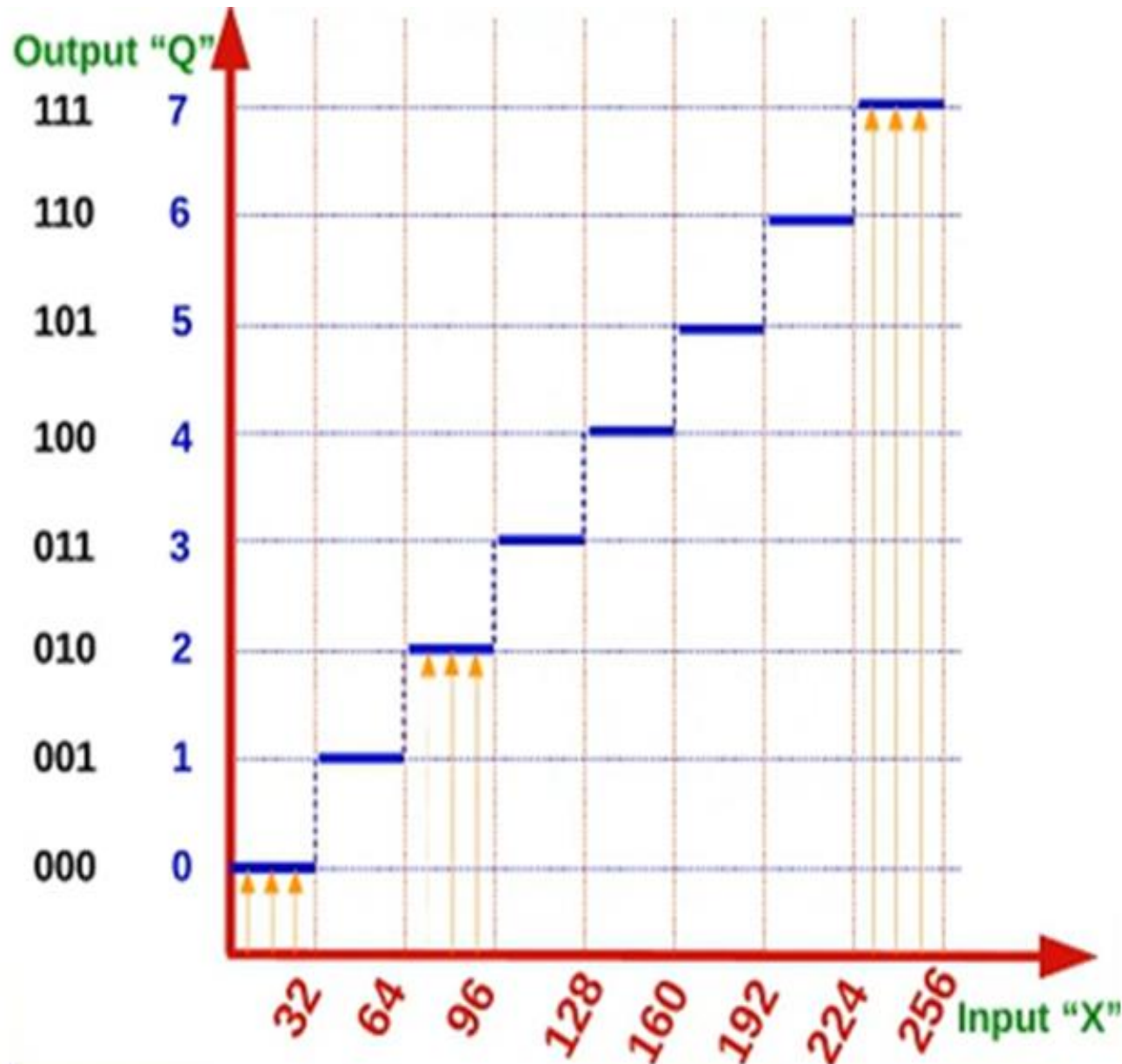
### Example:

- Pixel ( 0 -255)
- Full scale = 255 (0-255)
- Step = 32
- No of steps (levels) =  $256/32$   
 $= 8$  steps (3 bits)
- Compression ration =  $\frac{\log_2 255}{\log_2 7} = \frac{8}{3}$

Range	Q
0 – 31	0
32 – 63	1
64 – 95	2
96 – 127	3
128 – 159	4
160 – 191	5
192 – 223	6
224 - 255	7

# Uniform Quantizer (Encoding):

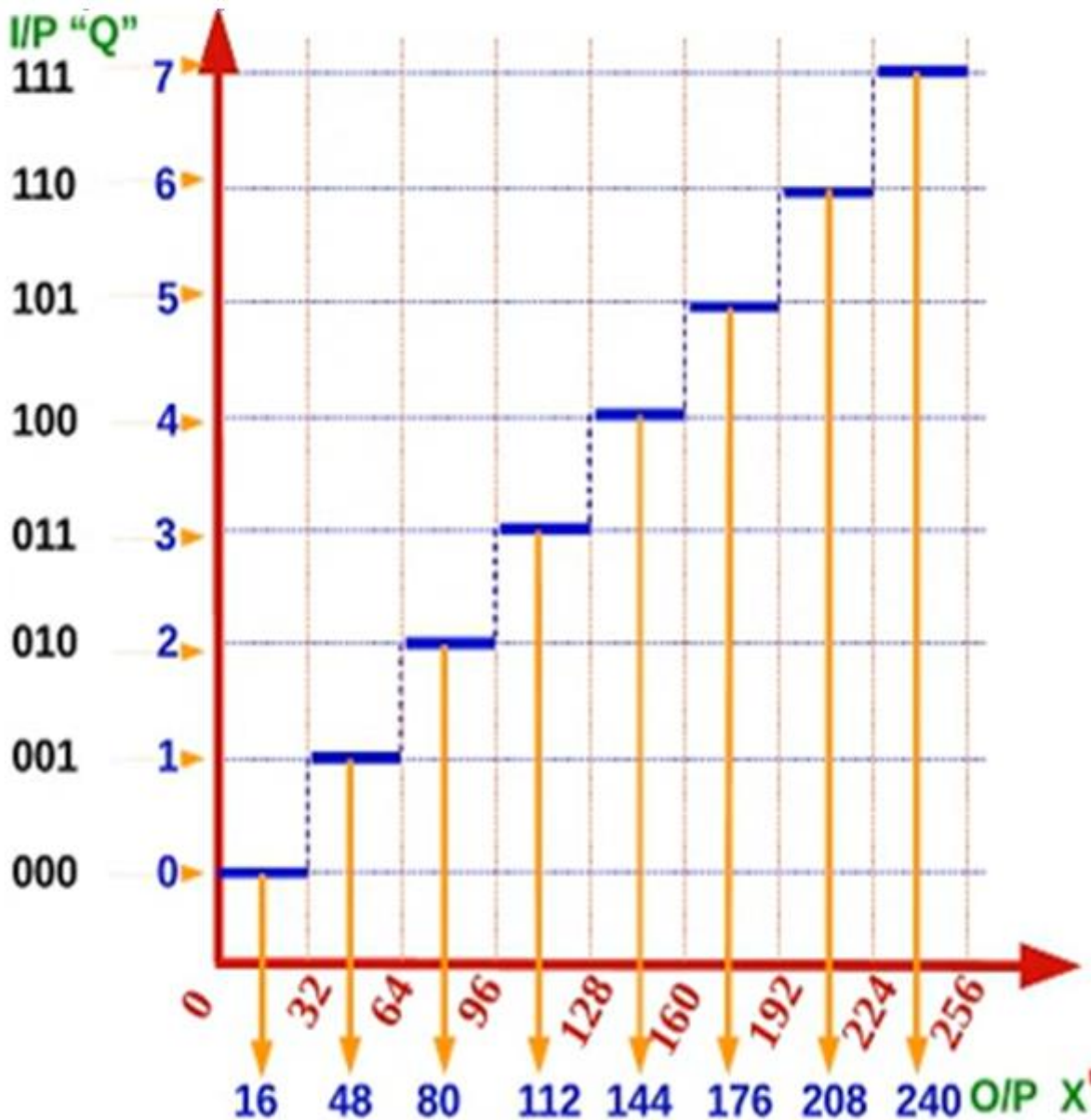
## Example:



Range	Q
0 – 31	0
32 – 63	1
64 – 95	2
96 – 127	3
128 – 159	4
160 – 191	5
192 – 223	6
224 - 255	7

## Dequantization (Decoder):

- Max Error =  $\frac{1}{2} \text{step} = 16$



Range	$Q$	$Q^{-1}$
0 – 31	0	16
32 – 63	1	48
64 – 95	2	80
96 – 127	3	112
128 – 159	4	144
160 – 191	5	176
192 – 223	6	208
224 - 255	7	240

First  $Q^{-1} = \frac{1}{2} \text{step}$

Second  $Q^{-1} = \text{First} + \text{step}$

Third  $Q^{-1} = \text{second} + \text{step}$

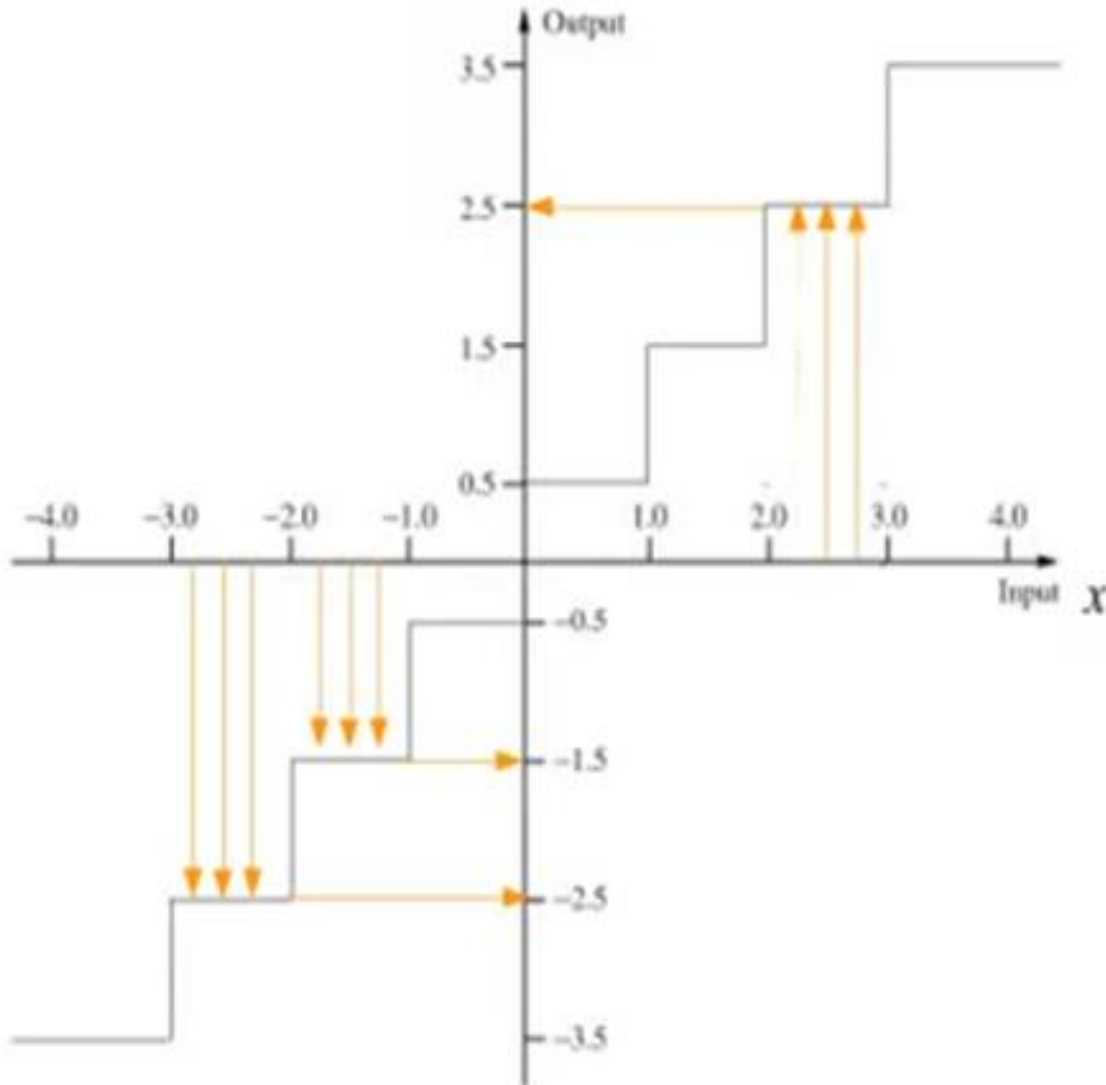


## **Design of uniform Quantizer for a given number of steps:**

- Full scale
- Number of steps.
- Step size.
- Max error
- Compression ratio.

# Scalar Quantizer with positive and negative input values:

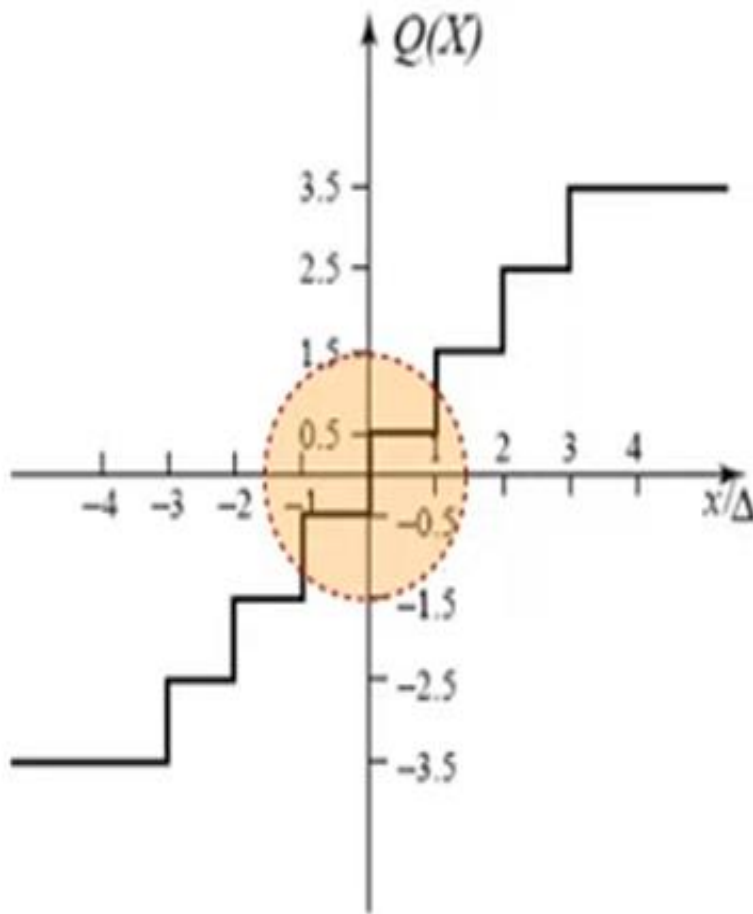
## Example: Quantization for temperature:



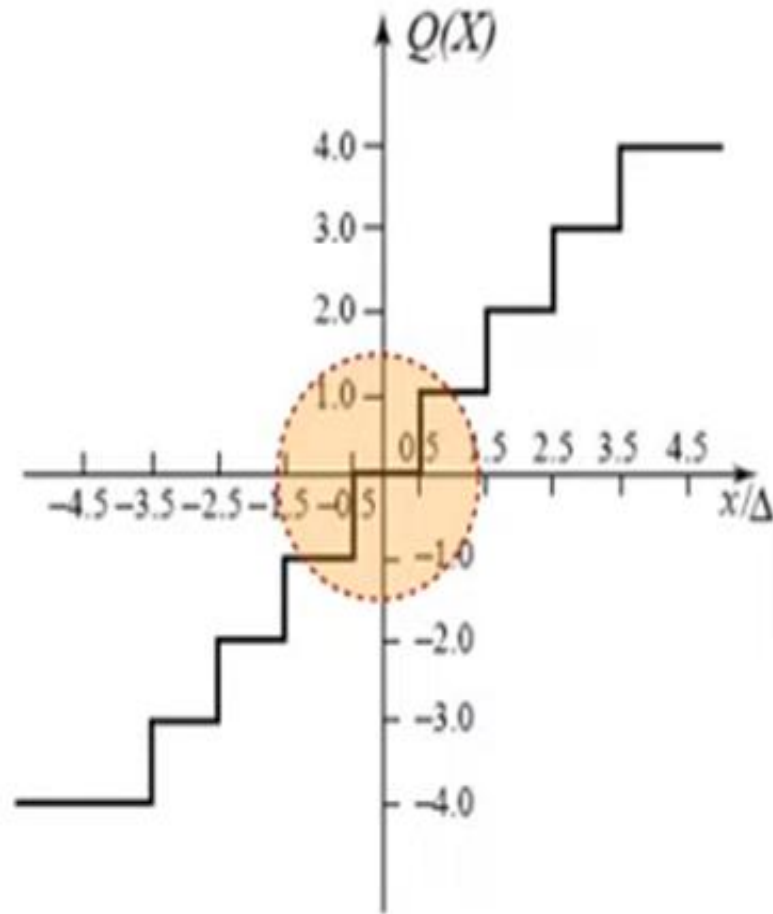
Q	Range	$Q^{-1}$
000	$[-4....-3[$	-3.5
001	$[-3....-2[$	-2.5
010	$[-2...-1[$	-1.5
011	$[-1....0[$	-0.5
100	$[0...1[$	0.5
101	$[1....2[$	1.5
110	$[2....3[$	2.5
111	$[3....4[$	3.5

## Types of Uniform Scalar Quantizers:

- a) Midrise quantizers have even number of output levels.
- b) Midtread quantizers have odd number of output levels including zero as one of them.



(a)



(b)

# Effect on increasing number of bits (Number of levels) on Quantization Error (Decompressed Image Quality)



## **Notes:**

**We measure the quality of quantizer by MSE (Mean Square Error)**

### Example:

Compress the following data using 2 bits uniform quantizer with step = 32, full scale = 127

6, 15, 17, 60, 100, 90, 66, 59, 18, 3, 5, 16, 14, 67, 63, 2, 98, 92.

Calculate MSE.

### Solution:

Range	$Q$	$Q^{-1}$
0 – 31	0	16
32 – 63	1	48
64 – 95	2	80
96 - 127	3	112

## Solution cont.

$$MSE = \frac{E^2}{18}$$

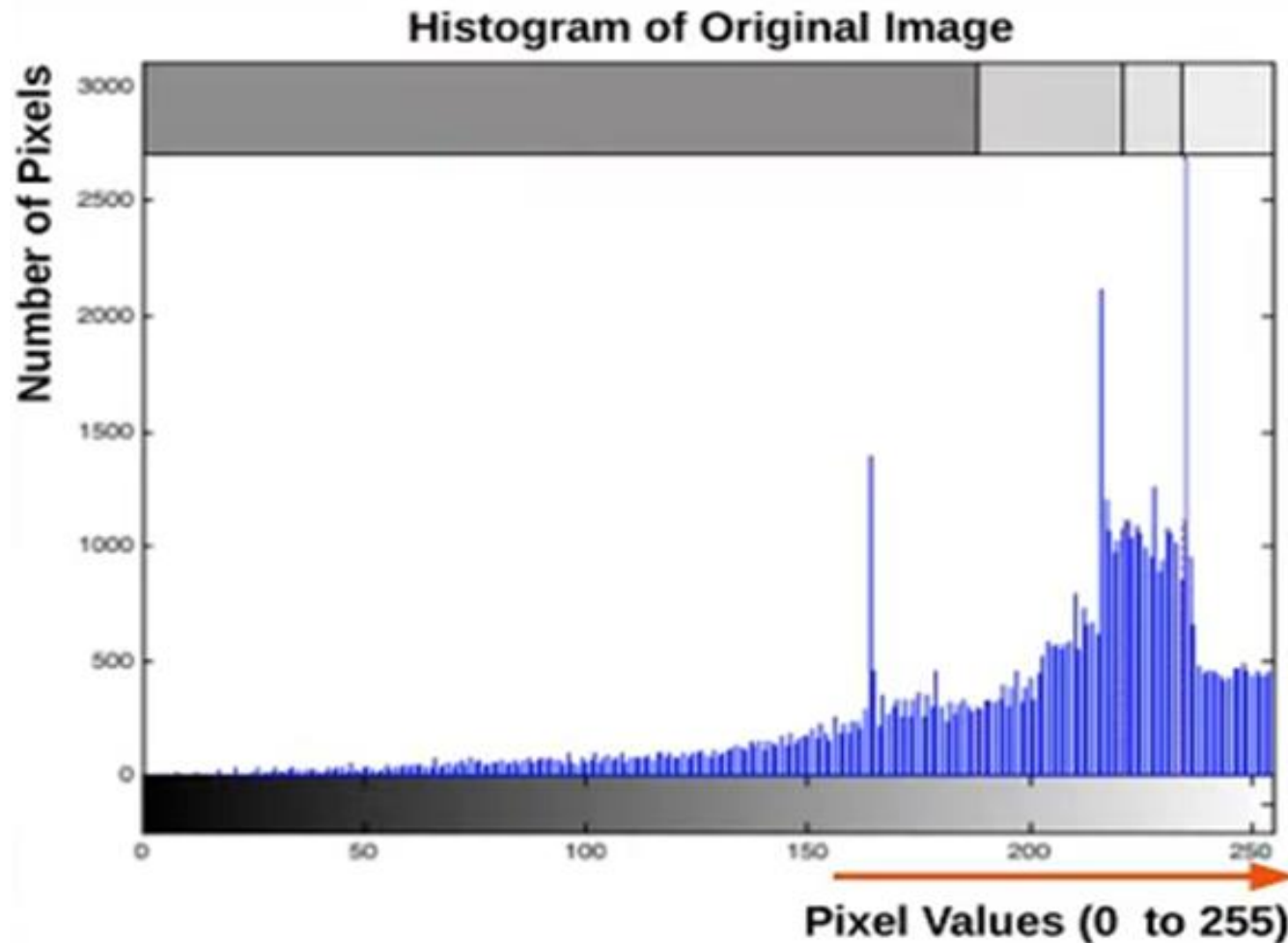
$$MSE = \frac{2035}{18} = 113$$

$$\text{Max Error} = 15 < \frac{1}{2} \text{step}$$

Range	$Q$	$Q^{-1}$
0 – 31	0	16
32 – 63	1	48
64 – 95	2	80
96 - 127	3	112

Data	$Q$	$Q^{-1}$	Error	Error <sup>2</sup>
6	0	16	10	100
15	0	16	1	1
17	0	16	1	1
60	1	48	12	144
100	3	112	12	144
90	2	80	10	100
66	2	80	14	196
59	1	48	11	121
18	0	16	2	4
3	0	16	13	169
5	0	16	11	121
16	0	16	0	0
14	0	16	2	4
67	2	80	13	169
63	1	48	15	225
2	0	16	14	196
98	3	112	14	196
92	2	80	12	144

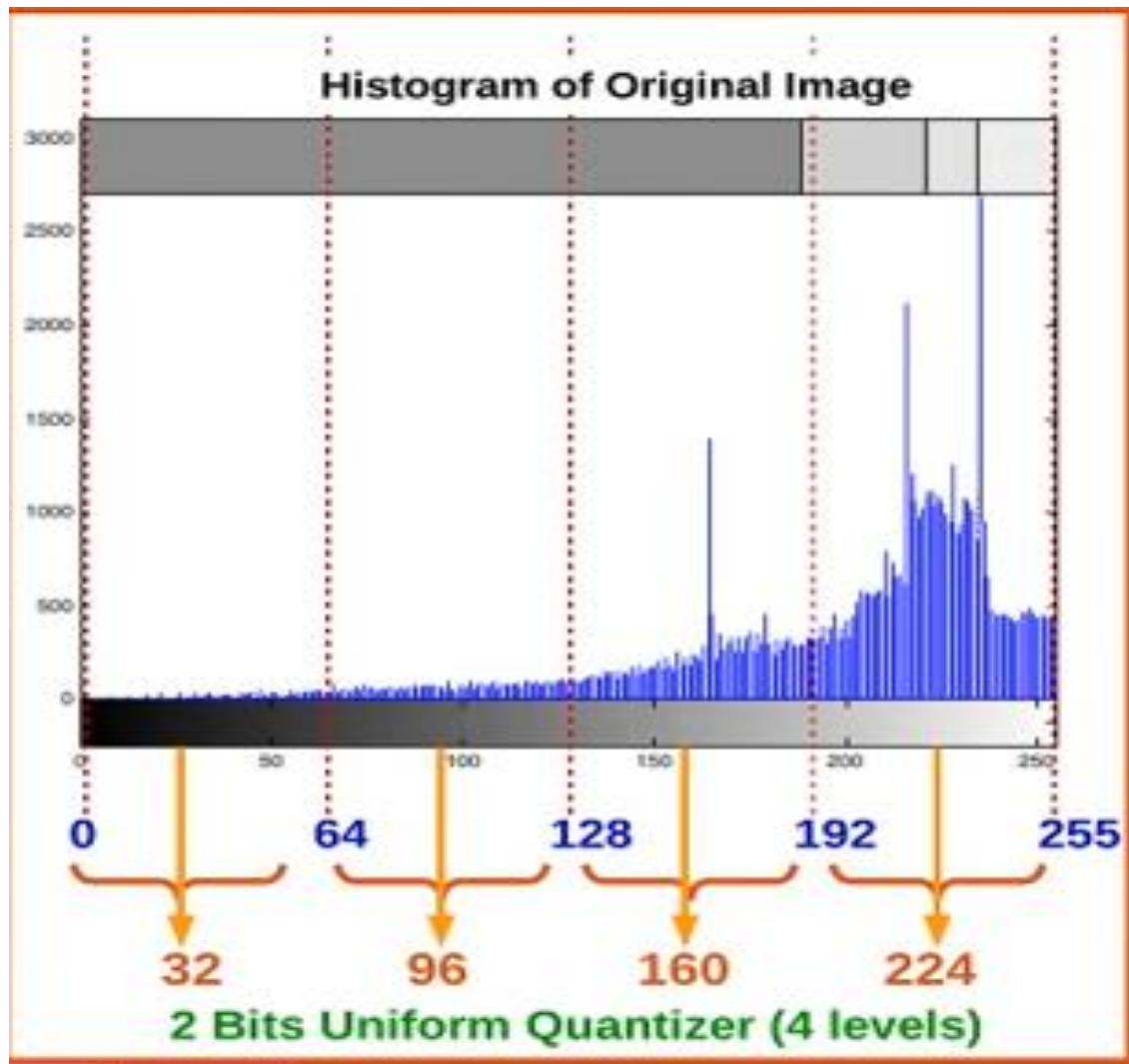
# Is uniform quantizer the best?





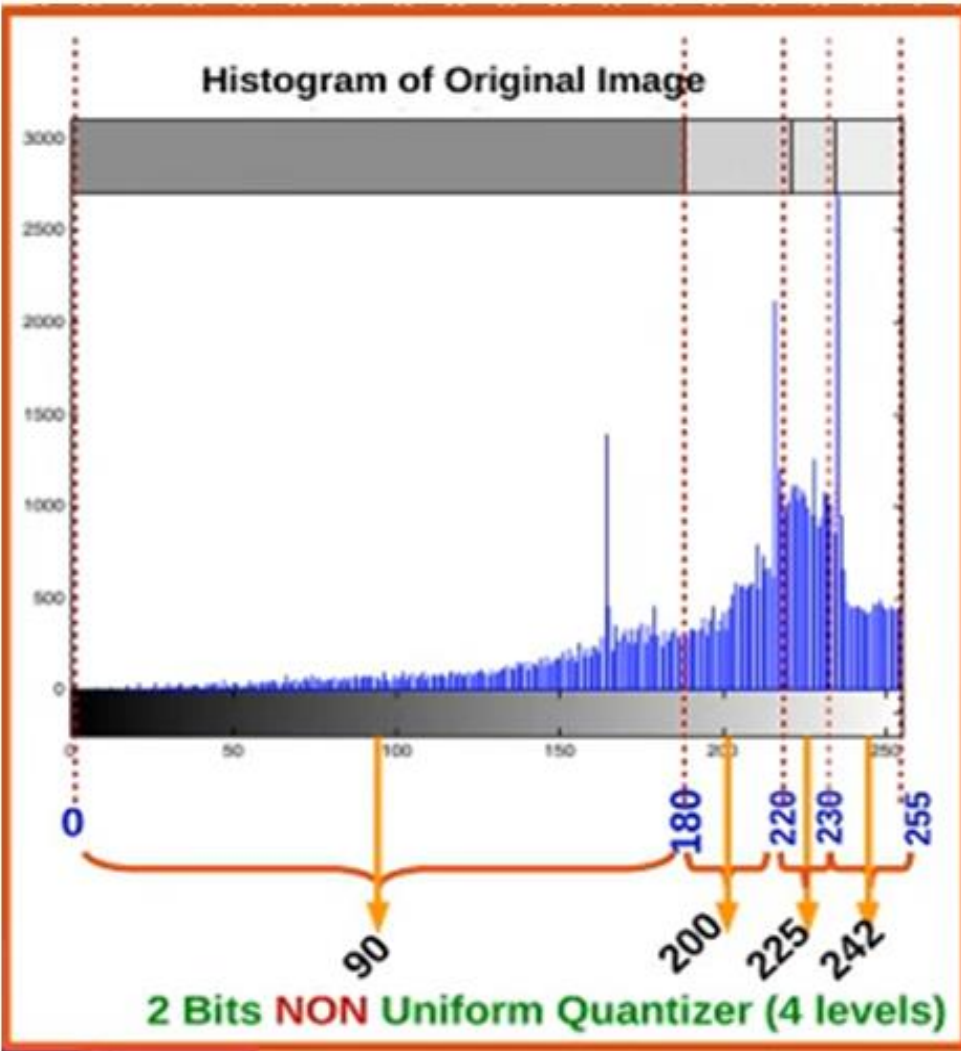
# Is uniform quantizer the best?

## 2 Bits Uniform quantizer:



# Is uniform quantizer the best?

## 2 Bits Non-Uniform quantizer:



*Original  
Image*  
(256 Gray Levels)



*Quantized  
Image*  
(4 Gray Levels)

# Comparison Between Uniform and Non -Uniform Scalar Quantizers:



**Original Image**  
**256 Levels (8 Bits)**



**2 Bits Compressed Image**  
**Using Uniform Quantizer**



**2 Bits Compressed Image**  
**Using Non Uniform Quantizer**

- **Both Compressed image are of same size.**
- **Compression ration =  $\frac{8}{2} = \frac{4}{1}$  *for both images***

### Example:

**Compress the following data using the following 2 bits Non-uniform quantizer.**

**6, 15, 17, 60, 100, 90, 66, 59, 18, 3, 5, 16, 14, 67, 63, 2, 98, 92.**

**Calculate MSE.**

<b>Range</b>	<b><math>Q</math></b>	<b><math>Q^{-1}</math></b>
<b>0 – 10</b>	<b>0</b>	<b>4</b>
<b>11 – 39</b>	<b>1</b>	<b>16</b>
<b>40 – 79</b>	<b>2</b>	<b>63</b>
<b>80 - 127</b>	<b>3</b>	<b>95</b>

## Solution:

$$MSE = \frac{E^2}{18}$$

$$MSE = \frac{138}{18} = 7.66$$

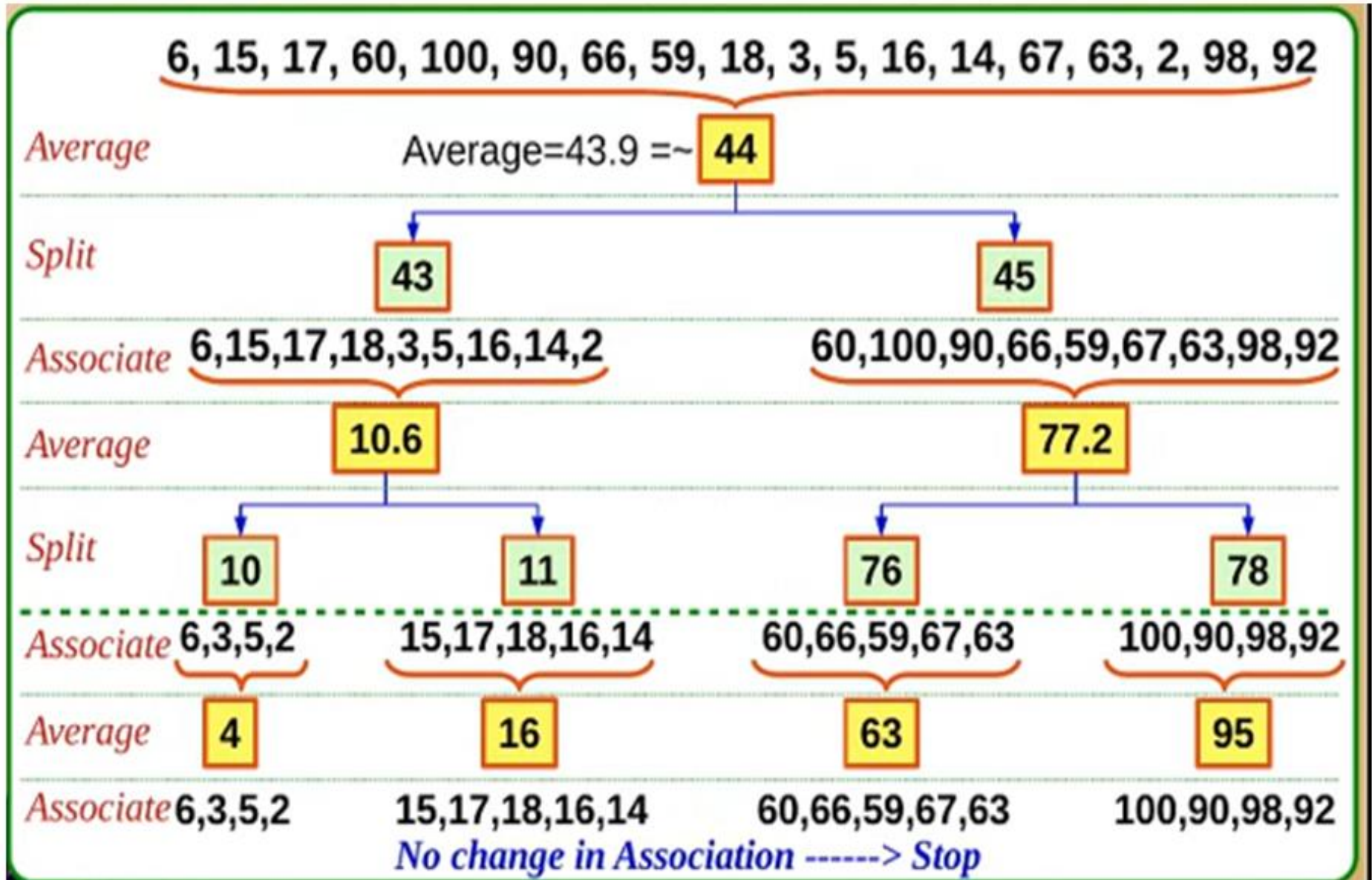
**Max Error = 5**

Range	$Q$	$Q^{-1}$
<b>0 – 10</b>	<b>0</b>	<b>4</b>
<b>11 – 39</b>	<b>1</b>	<b>16</b>
<b>40 – 79</b>	<b>2</b>	<b>63</b>
<b>80 - 127</b>	<b>3</b>	<b>95</b>

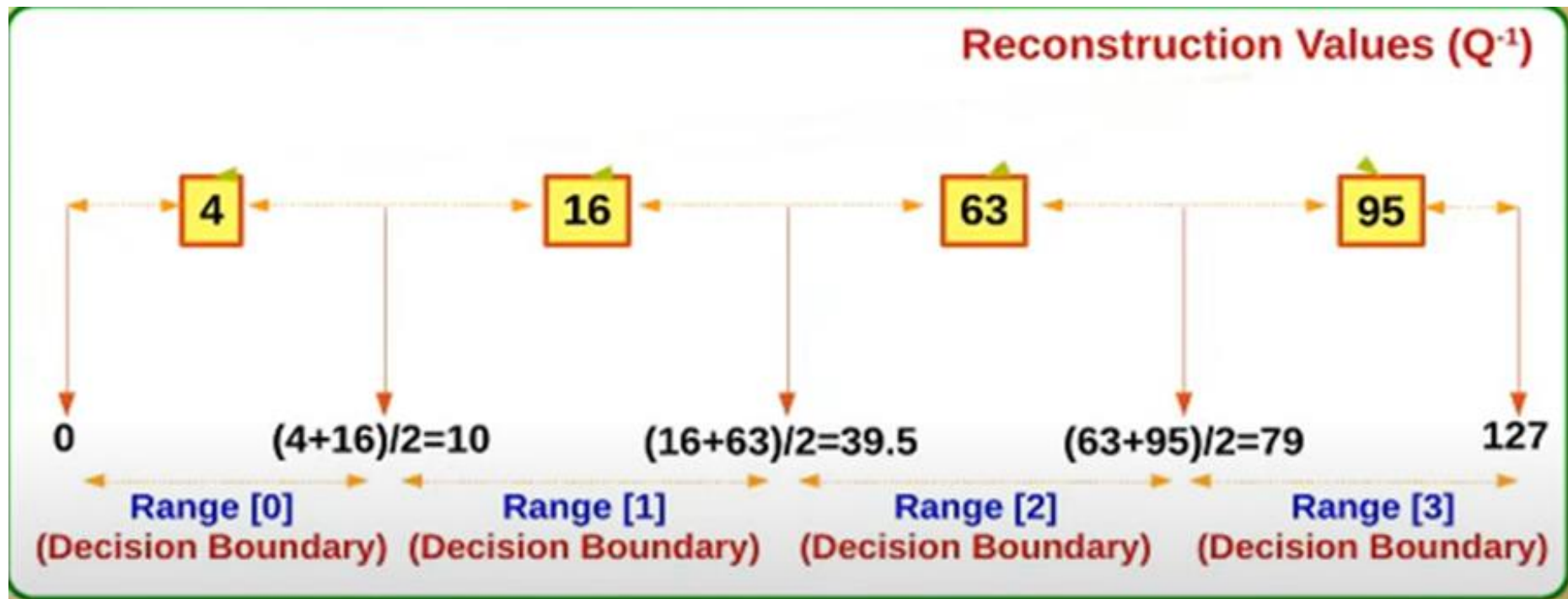
Data	$Q$	$Q^{-1}$	Error	Error <sup>2</sup>
6	0	4	2	4
15	1	16	1	1
17	1	16	1	1
60	2	63	3	9
100	3	95	5	25
90	3	95	5	25
66	2	63	3	9
59	2	63	4	16
18	1	16	2	4
3	0	4	1	1
5	0	4	1	1
16	1	16	0	0
14	1	16	2	4
67	2	63	4	16
63	2	63	0	0
2	0	4	2	4
98	3	95	3	9
92	3	95	3	9



# Design of Non-Uniform Quantizer Using LBG Algorithm with Splitting:



# Design of Non-Uniform Quantizer Using LBG Algorithm with Splitting:



Range	Q	$Q^{-1}$
$[0 \dots 10[$	0	4
$[10 \dots 39.5[$	1	16
$[39.5 \dots 79[$	2	63
$[79 \dots 127]$	3	95